

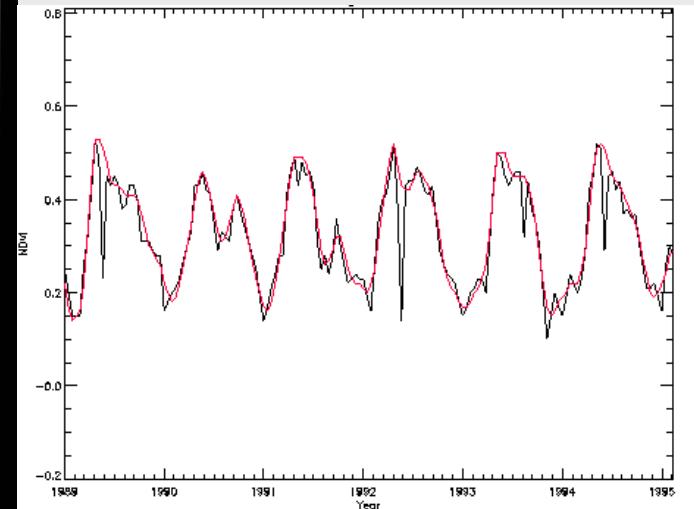
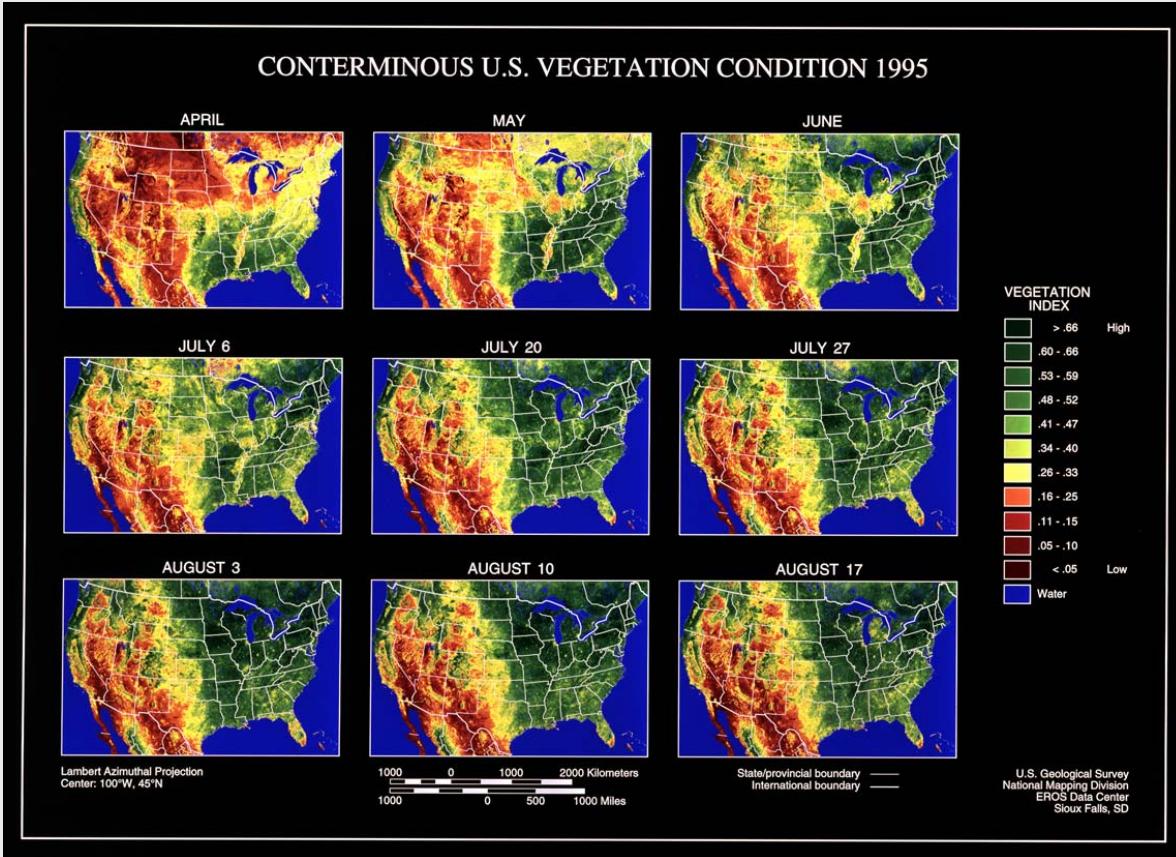


# Monitoring Phenological Trends from Satellite Imagery

Bradley C. Reed  
Jesslyn F. Brown  
Andrew Whalen

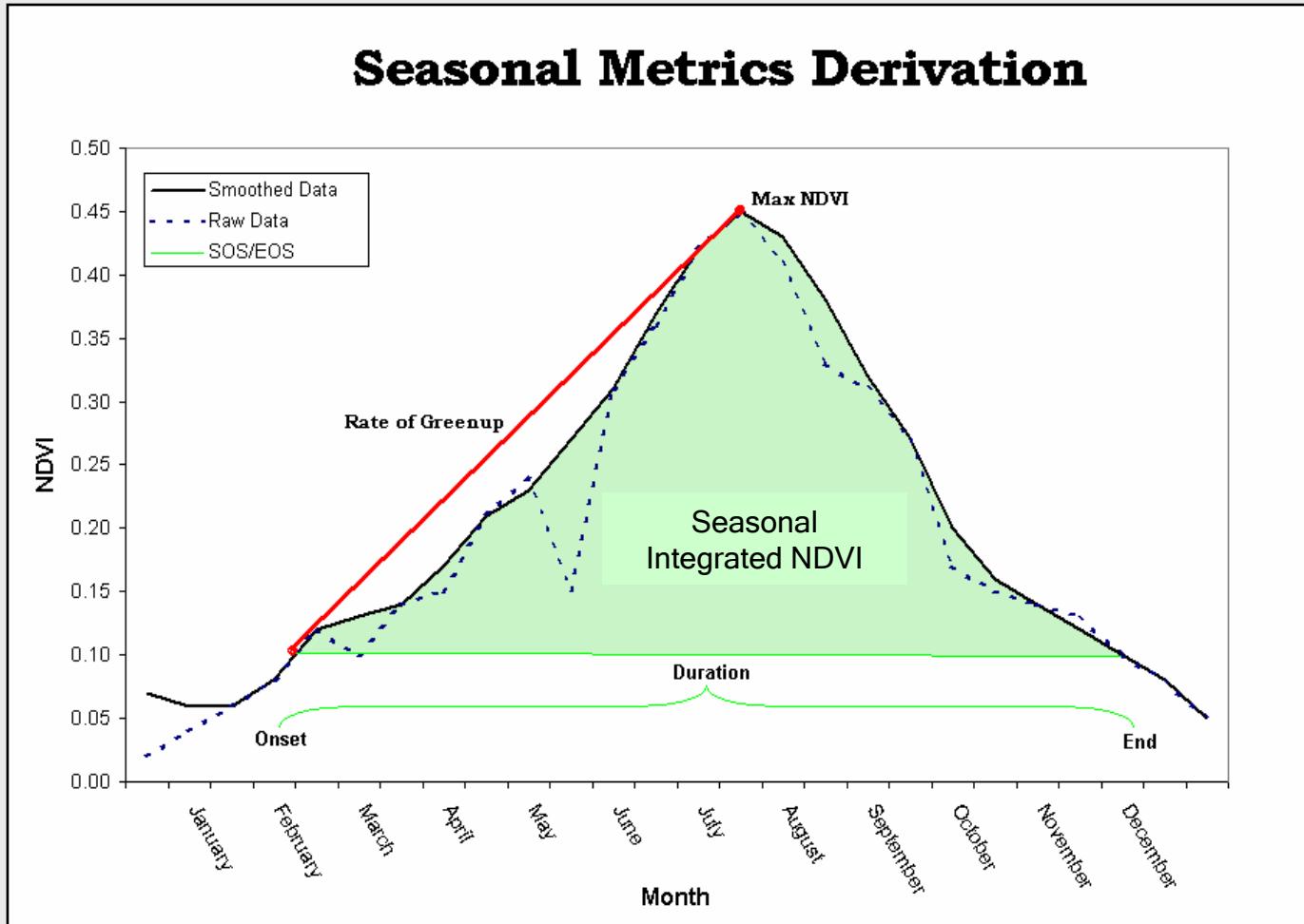
USGS National Center for EROS  
Sioux Falls, SD USA

# Remote Sensing of Phenology



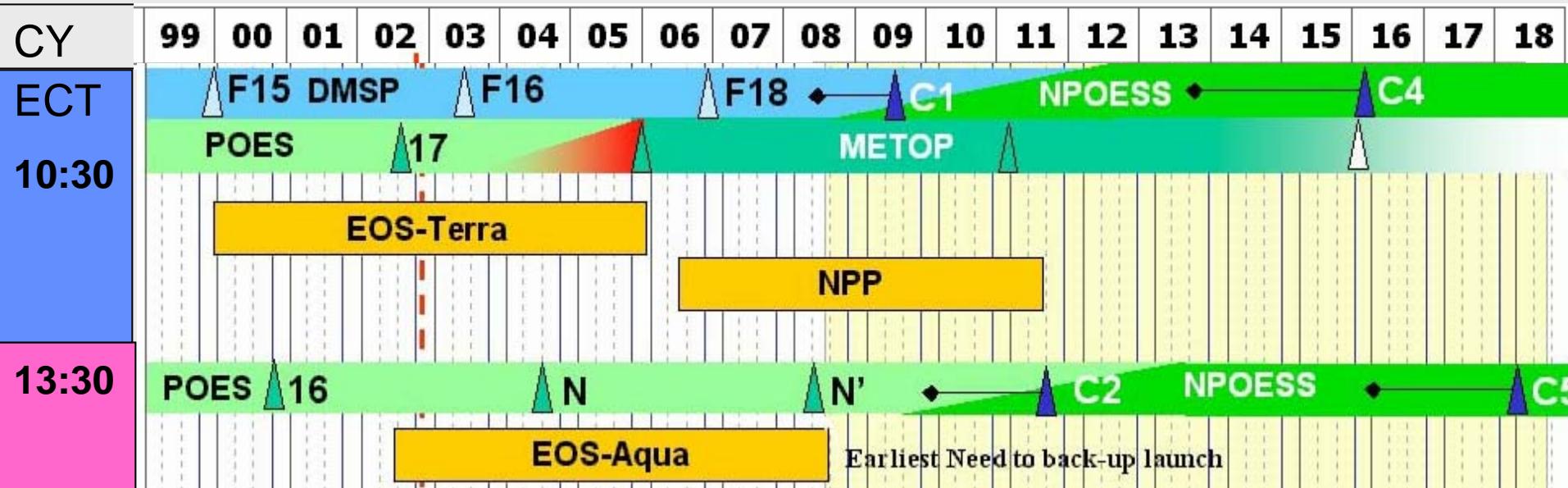
NDVI is linked to  
photosynthetic capacity

# Phenological Metrics can be consistently derived from the annual VI cycle



# Transition to new generation sensors

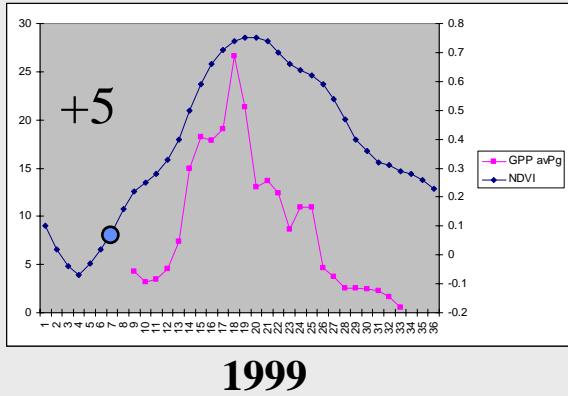
AVHRR → MODIS → NPP → NPOESS



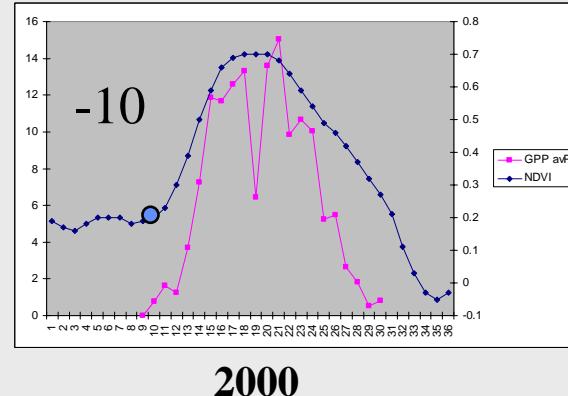
# Satellite SOS vs. GPP estimates

(USDA-Agriflux towers)

## Mandan, ND

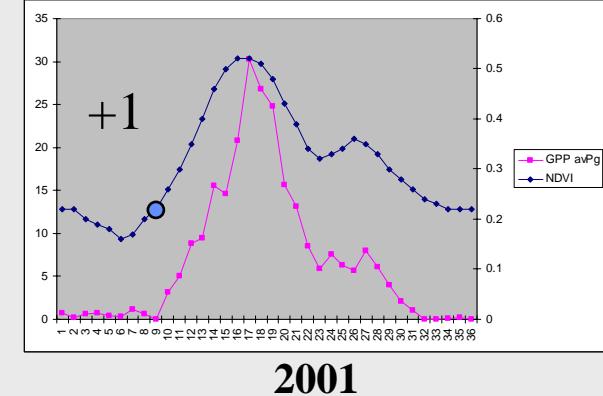
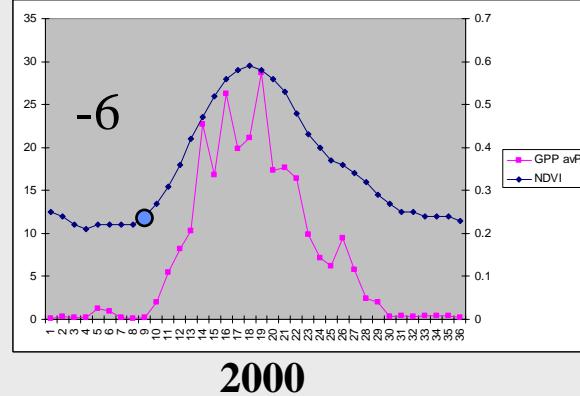
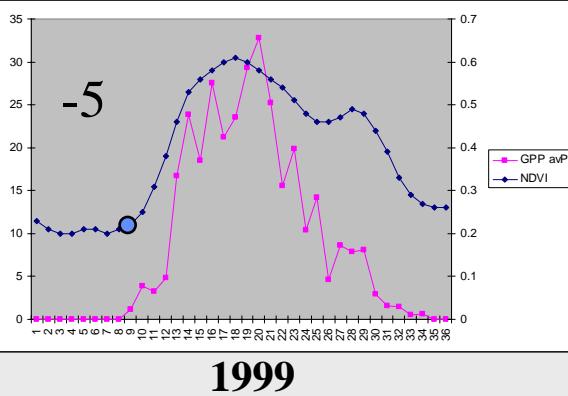


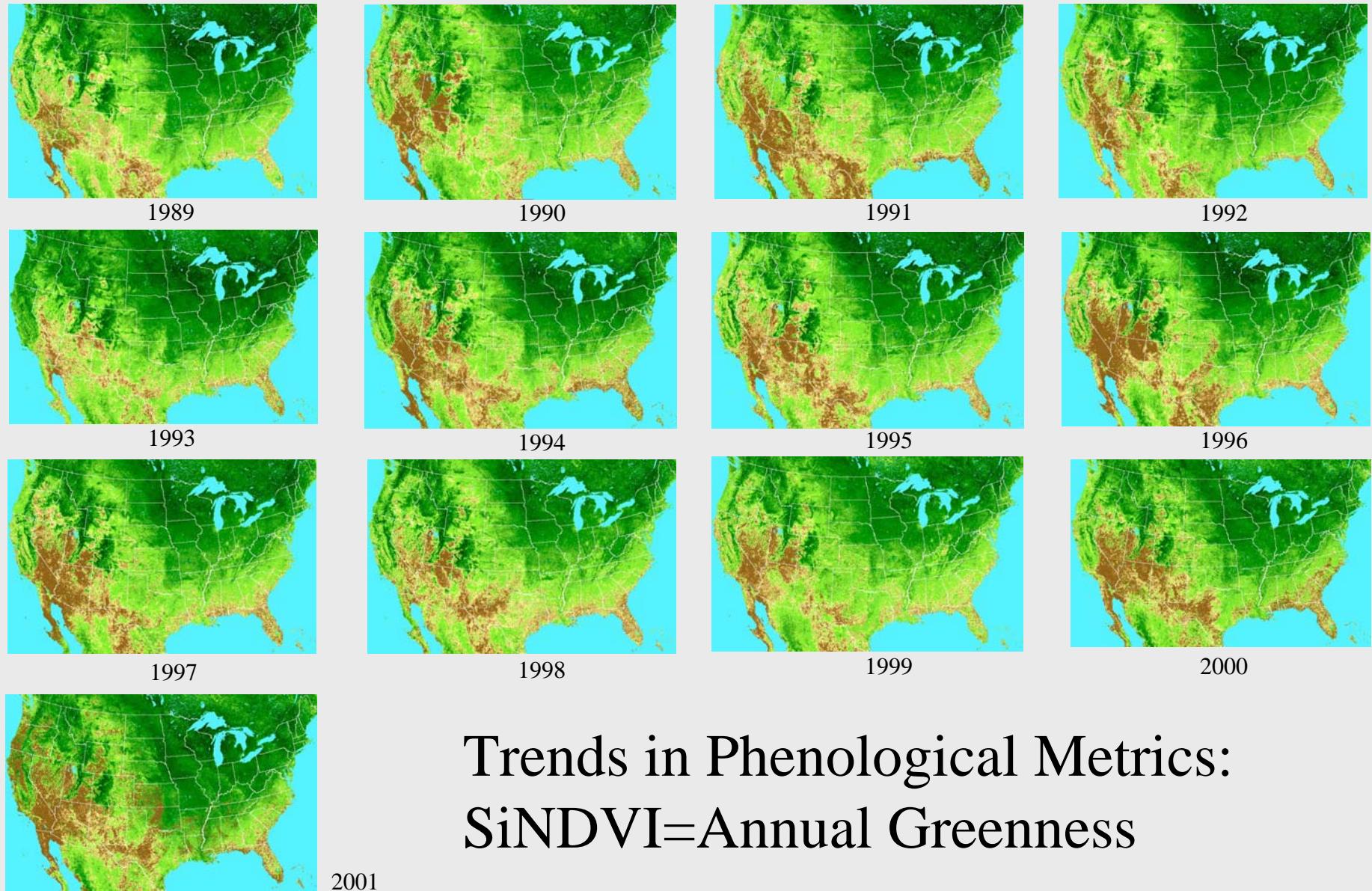
● = Start of Season



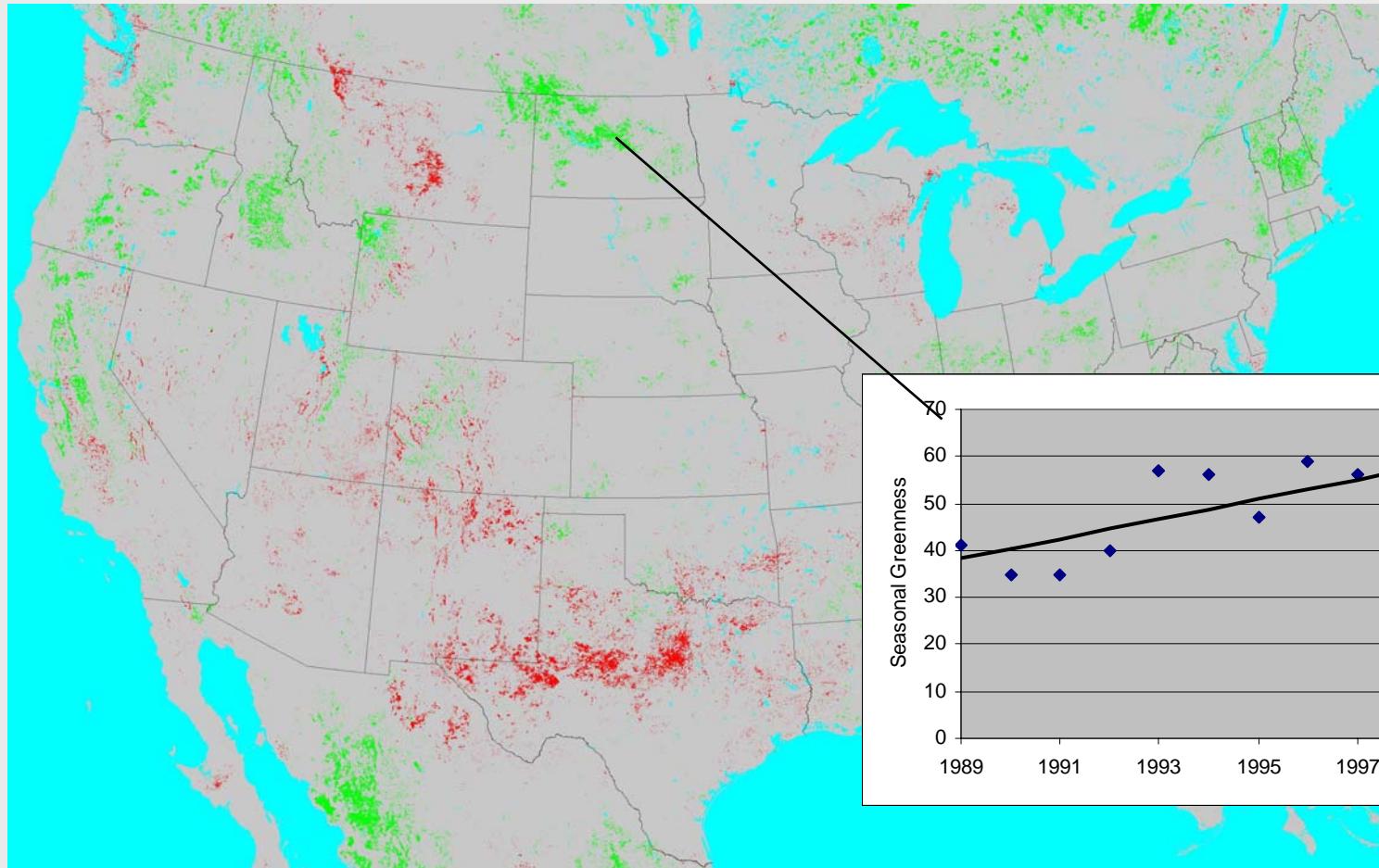
Days offset  
 $n = 13$   
 $\bar{x} = 2.23$   
 $std = 8.21$

## Woodward, OK



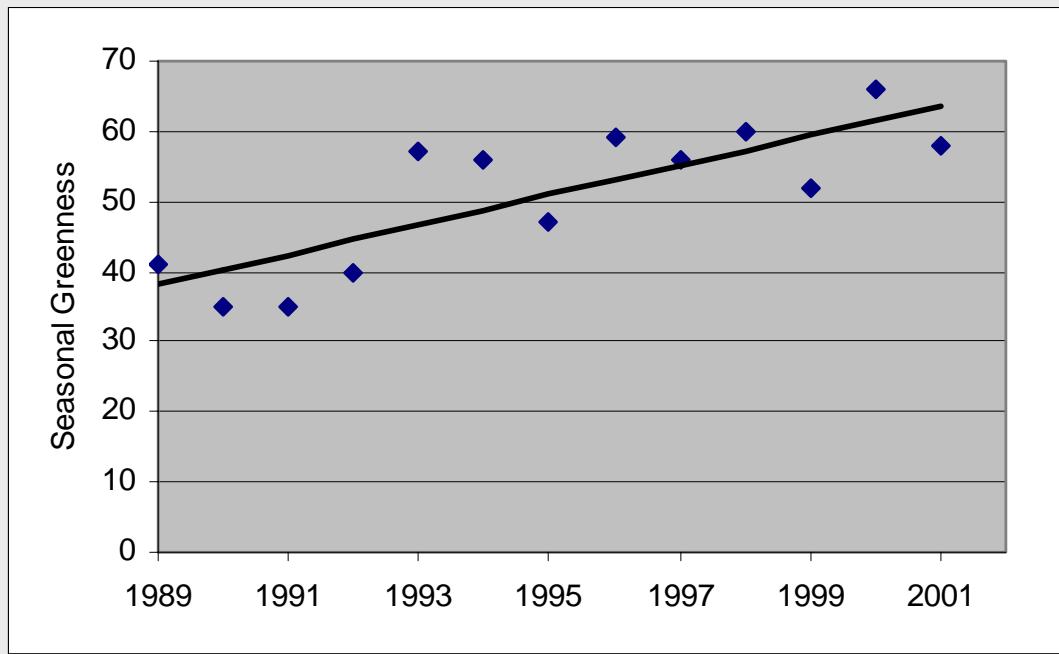


## Regions with Significant Trends in Annual Greenness: Is the slope ( $b$ ) of best-fit line significantly different from 0?



- Decreasing Greenness
- Increasing Greenness

# Regions with Significant Trends in Annual Greenness: Is the slope (b) of best-fit line significantly different from 0?



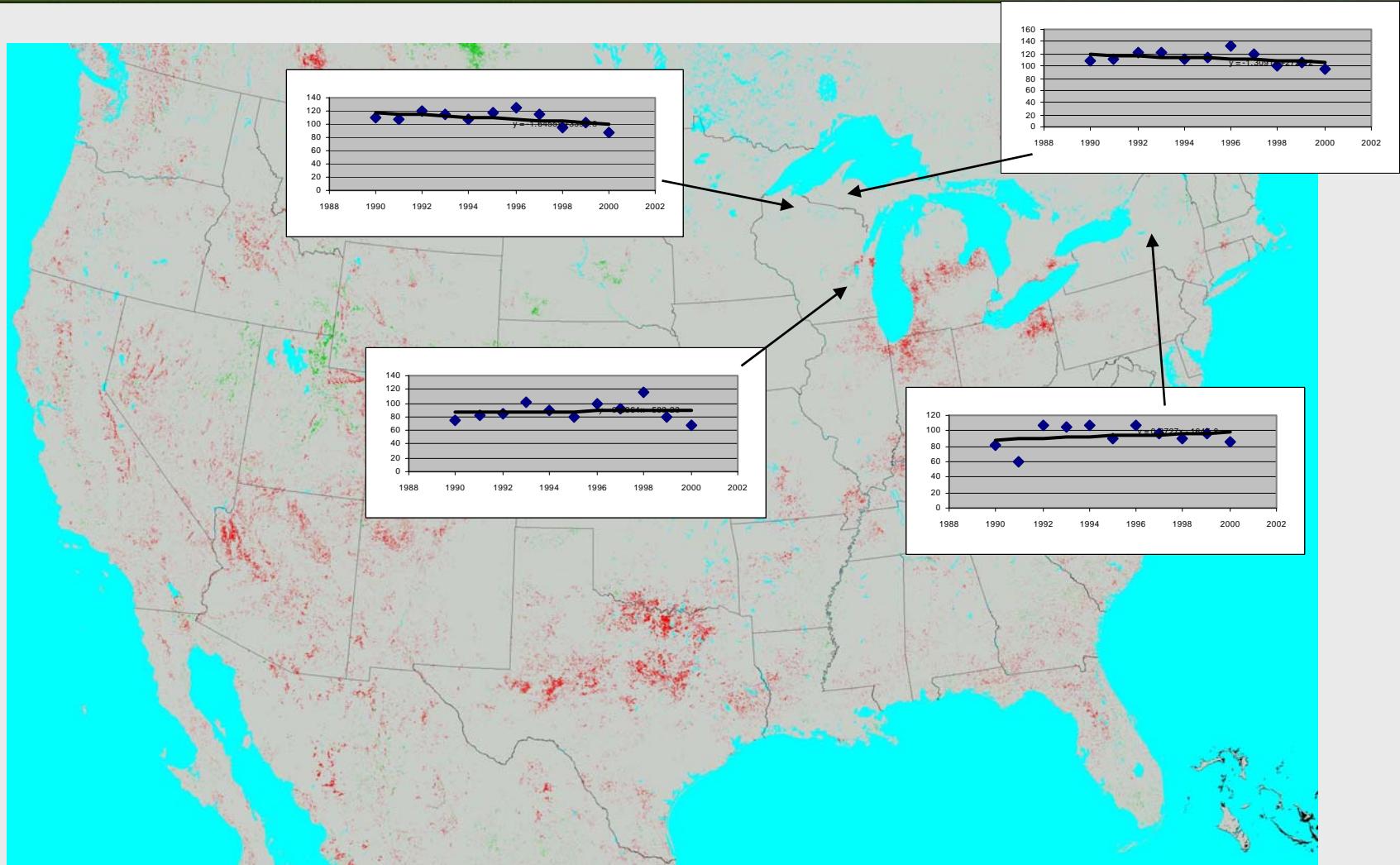
$$b = 2.12$$

$$\text{standard error (s)} = 0.46$$

$$\text{t-test: } t = b/s = 4.60$$

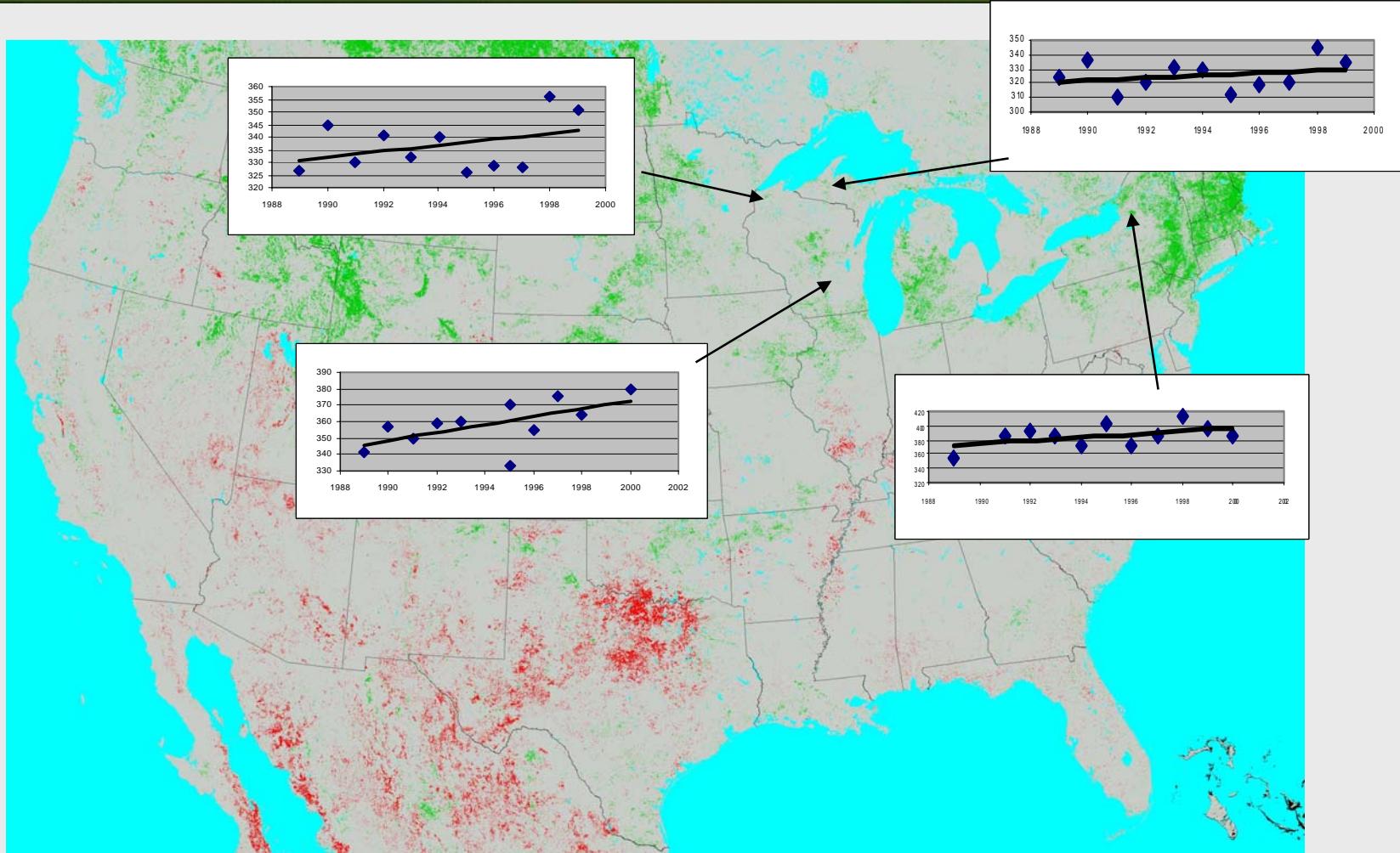
t-distribution at 0.05 level of significance and  $df = 11 = 2.201$ ,

$4.60 > 2.201$ , therefore is significant



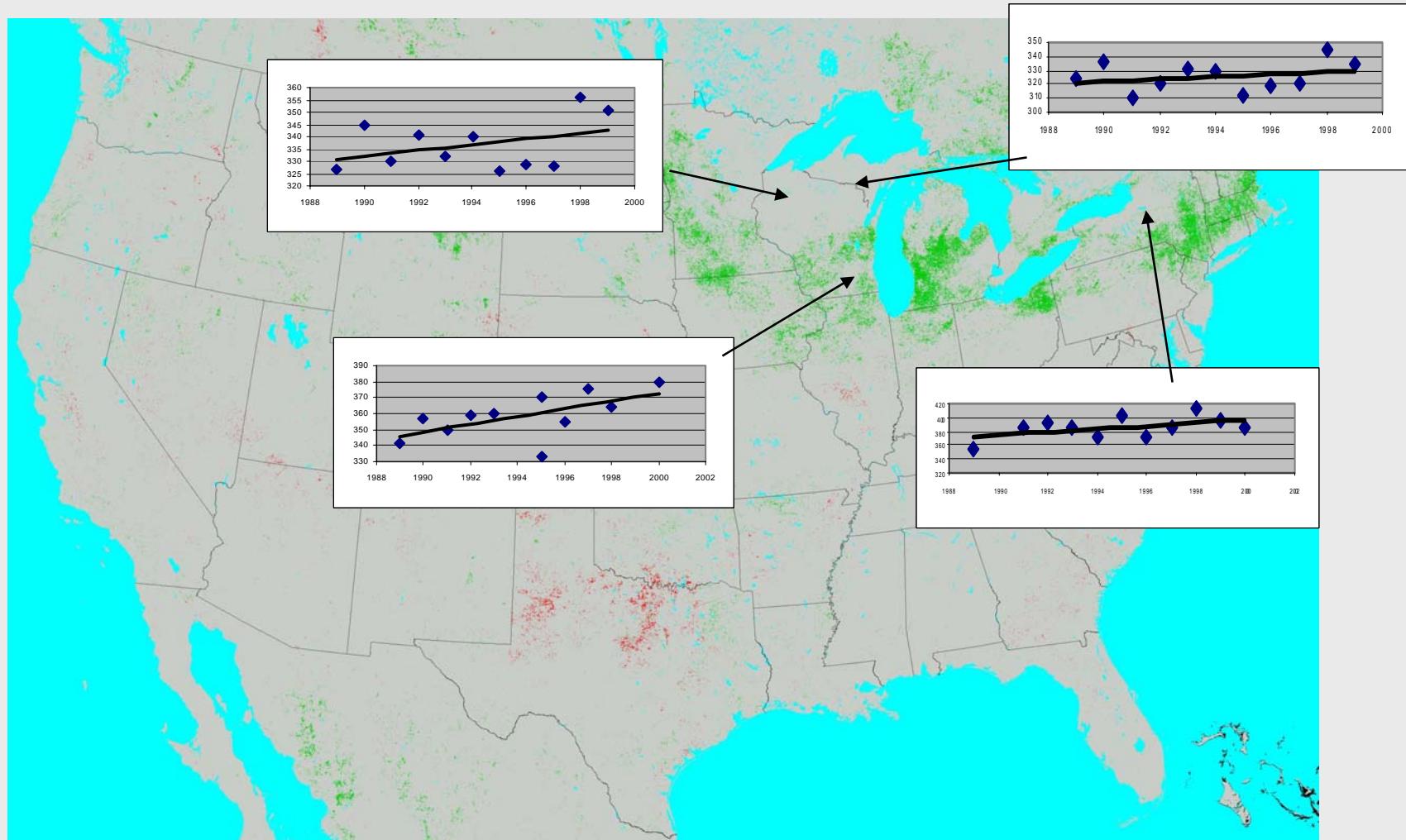
█ Earlier SOS  
█ Later SOS

Trends in SOS Time 1989-2001 and  
trends in time of lake thaw



Trends in EOS Time 1989-2001 and  
trends in time of lake freeze

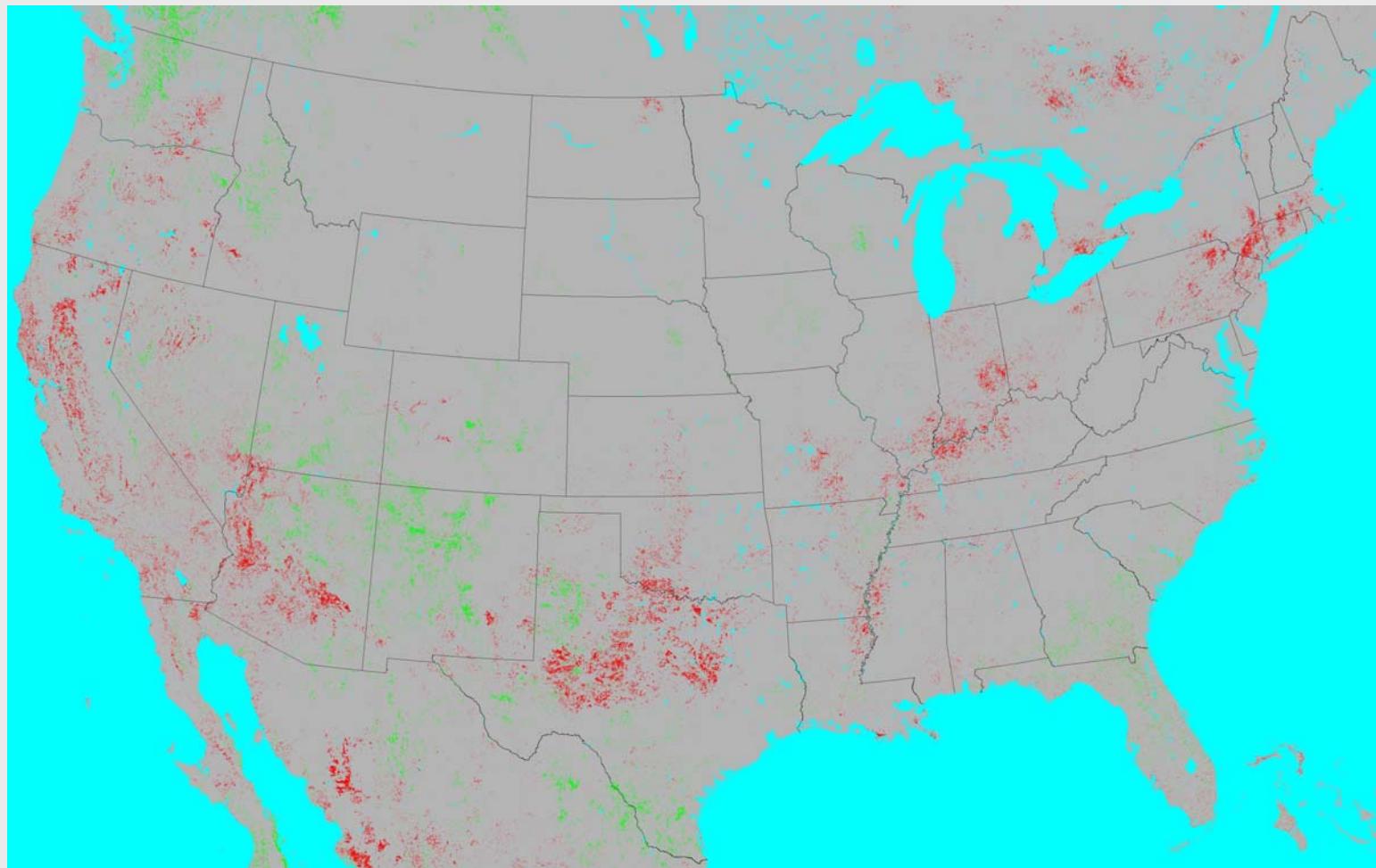
■ Earlier EOS  
■ Later EOS



■ Shorter Duration  
■ Longer Duration

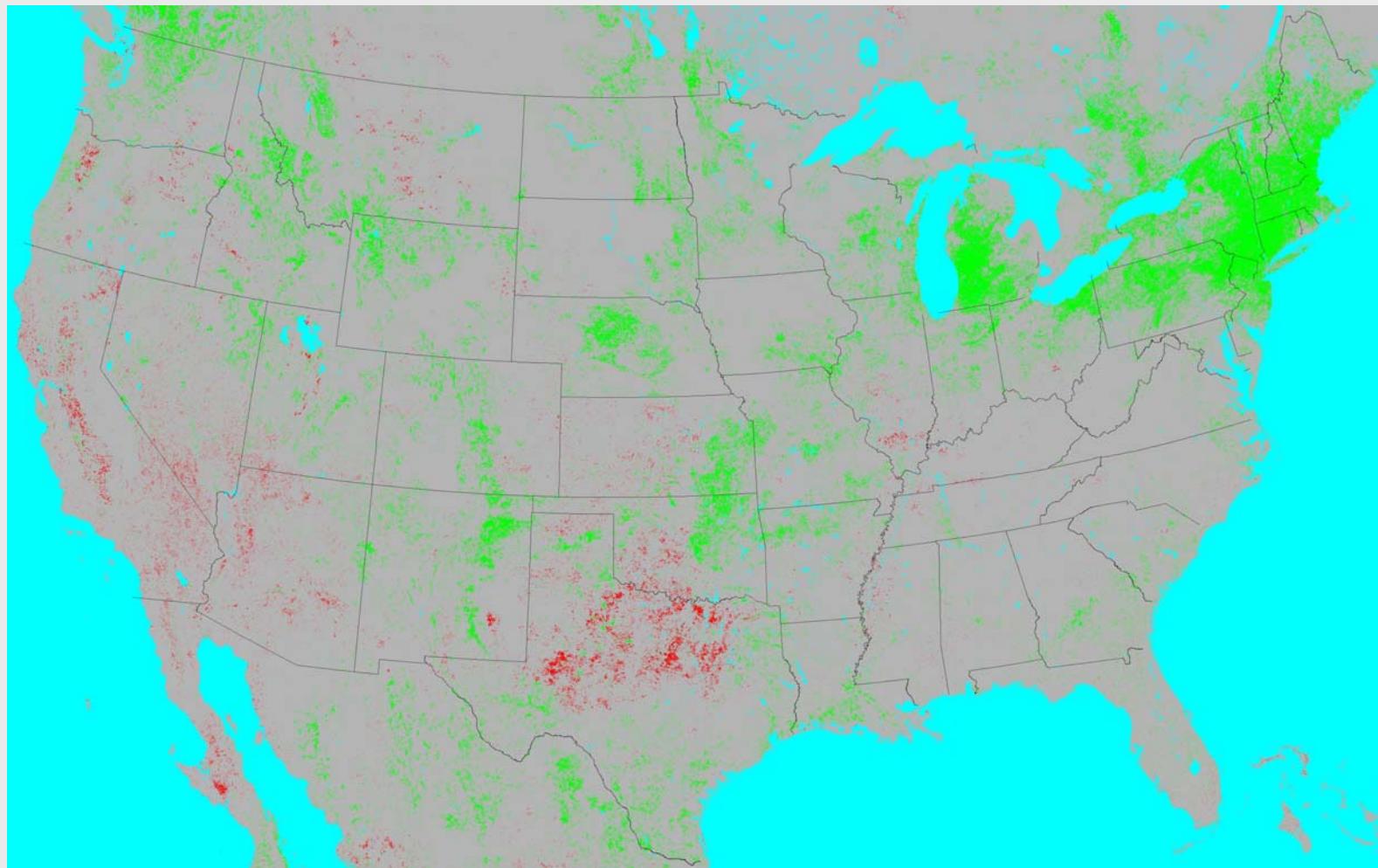
Trends in Duration of Season 1989-2001 and  
trends in length of lake freeze-free period

## SOST 1989-2003



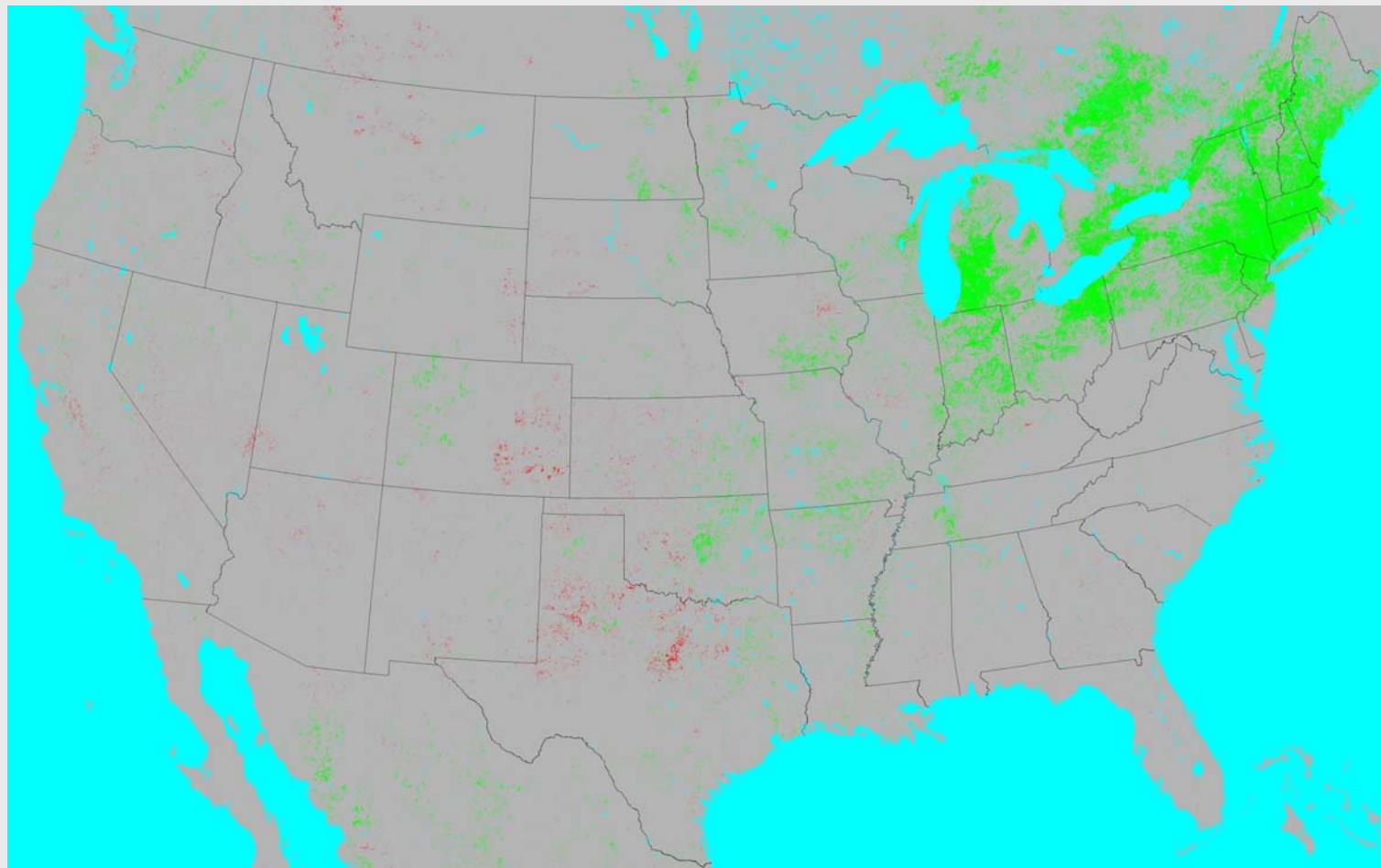
- █ Earlier SOS
- █ Later SOS

## EOST 1989-2003



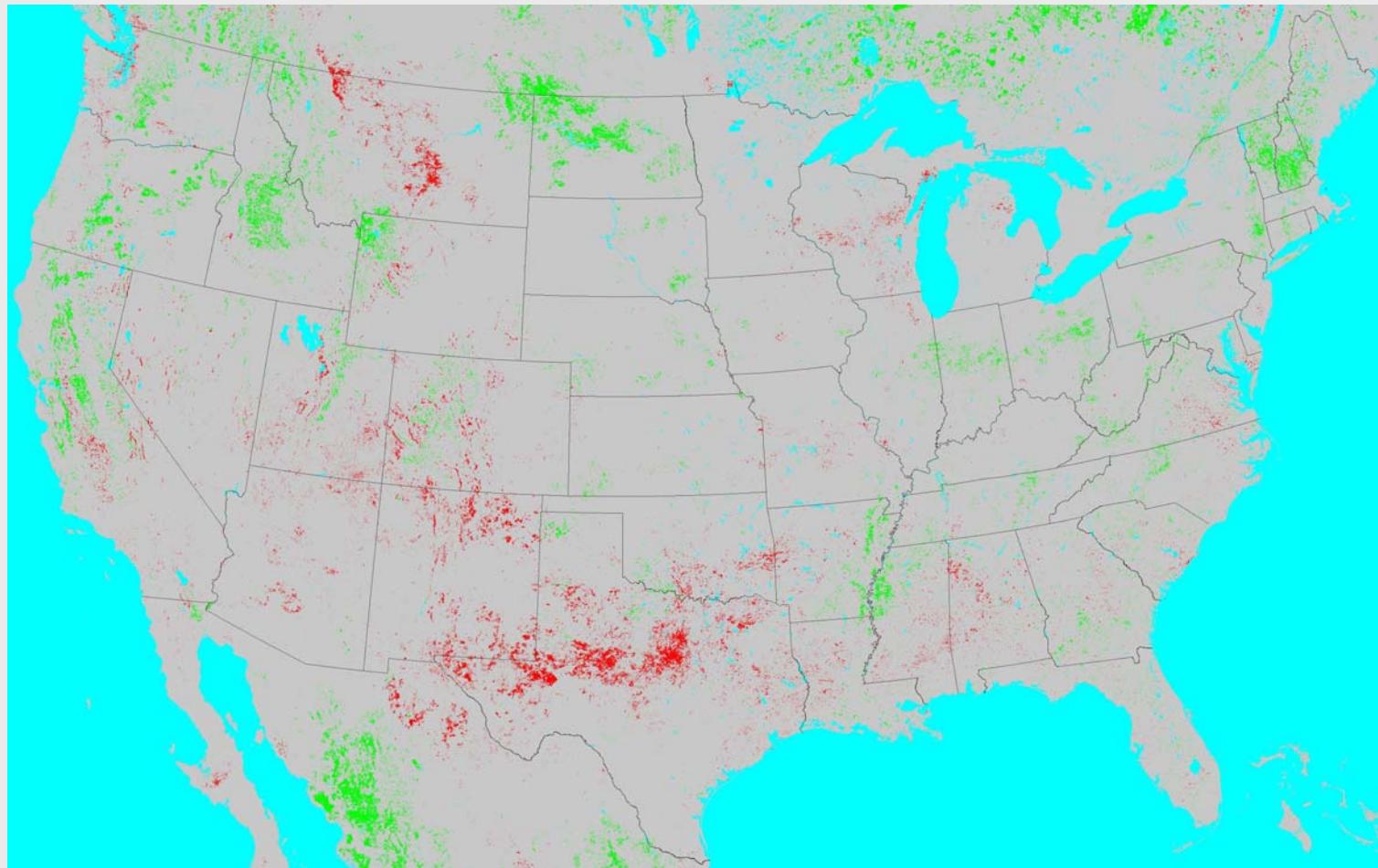
- Earlier EOS
- Later EOS

# Trends in Duration of growing season 1989-2003



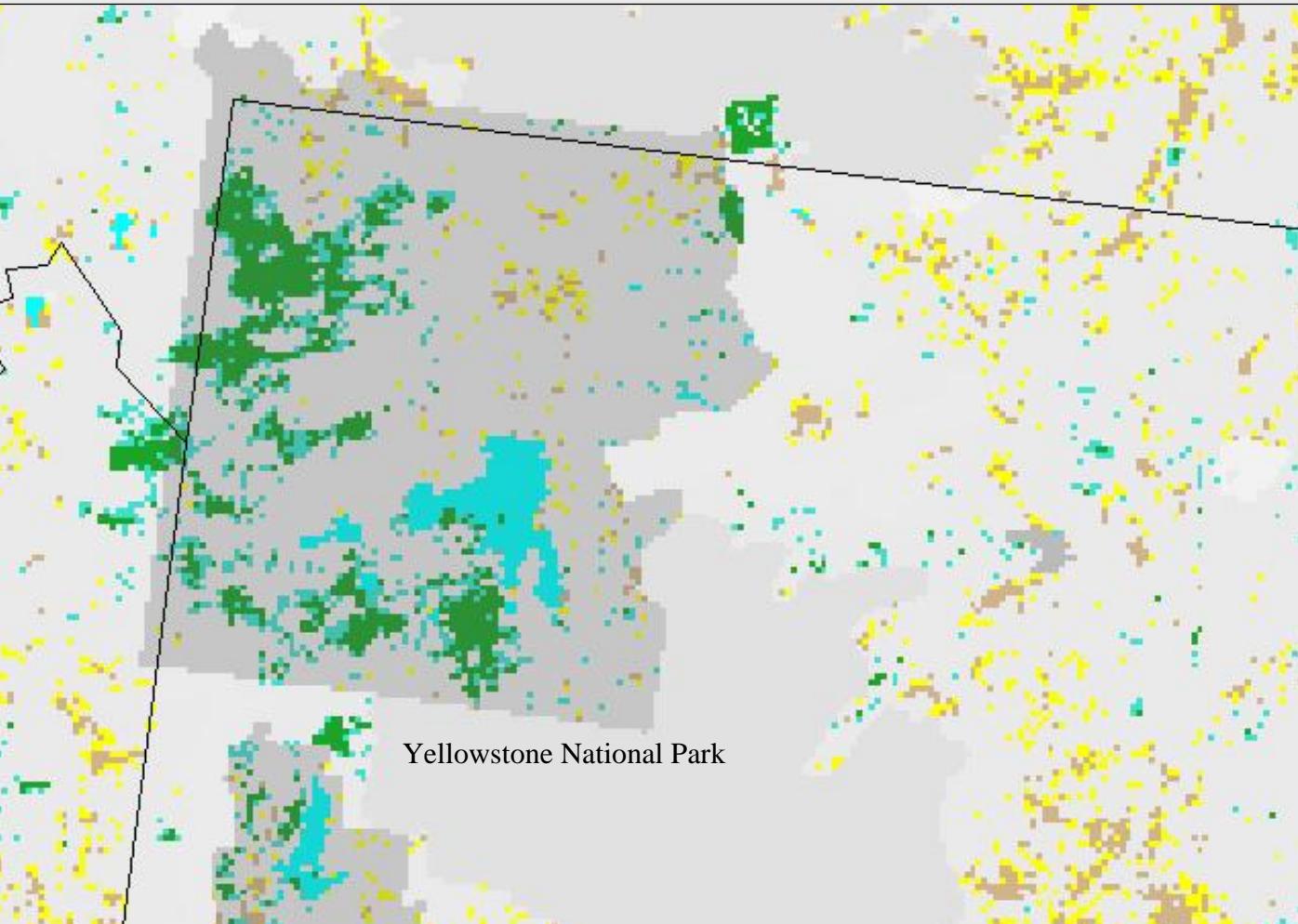
- Shorter Duration
- Longer Duration

# Trends in Integrated NDVI 1989-2003



- Decreasing Greenness
- Increasing Greenness

# Analysis of Trends

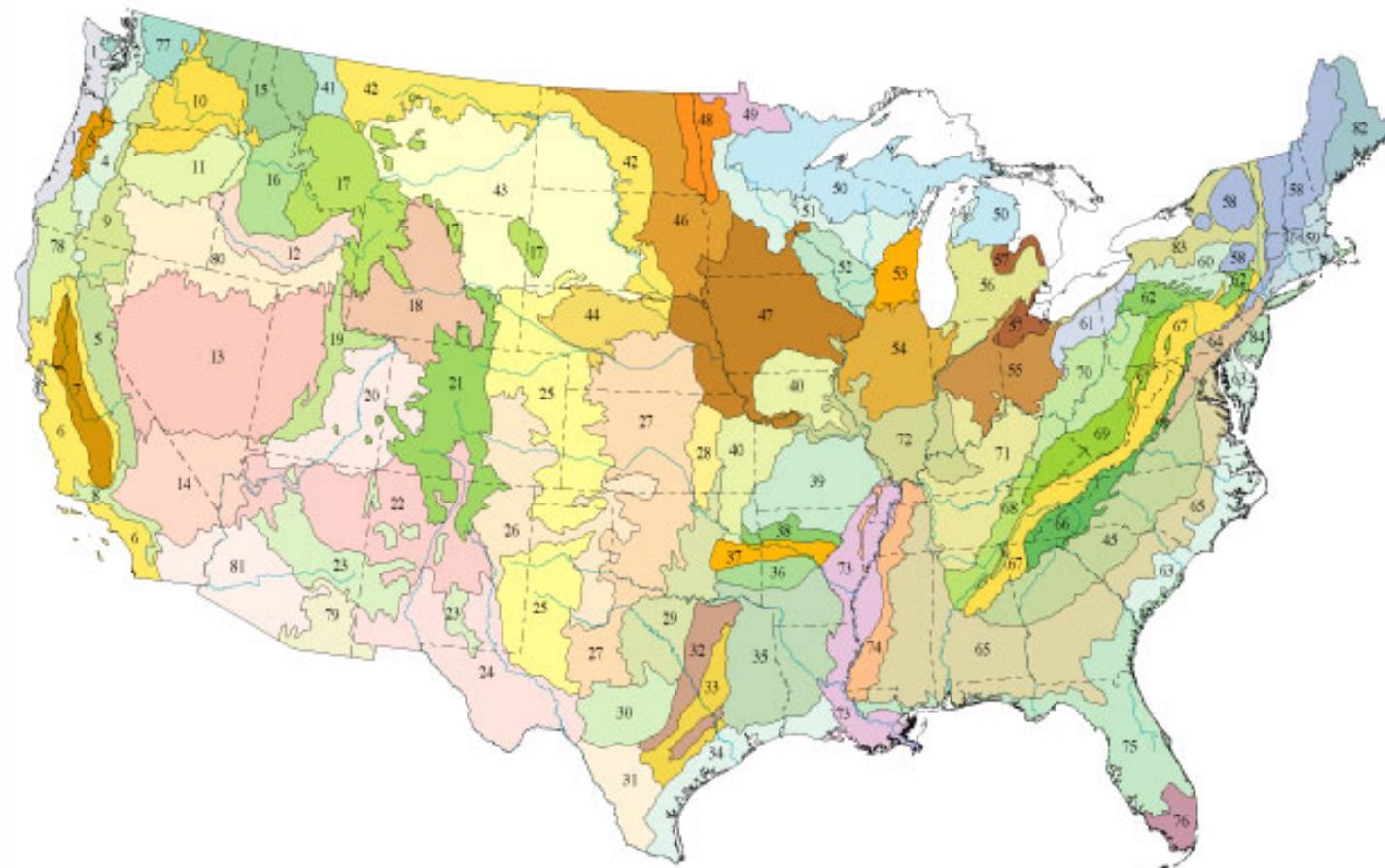


## Driving Forces

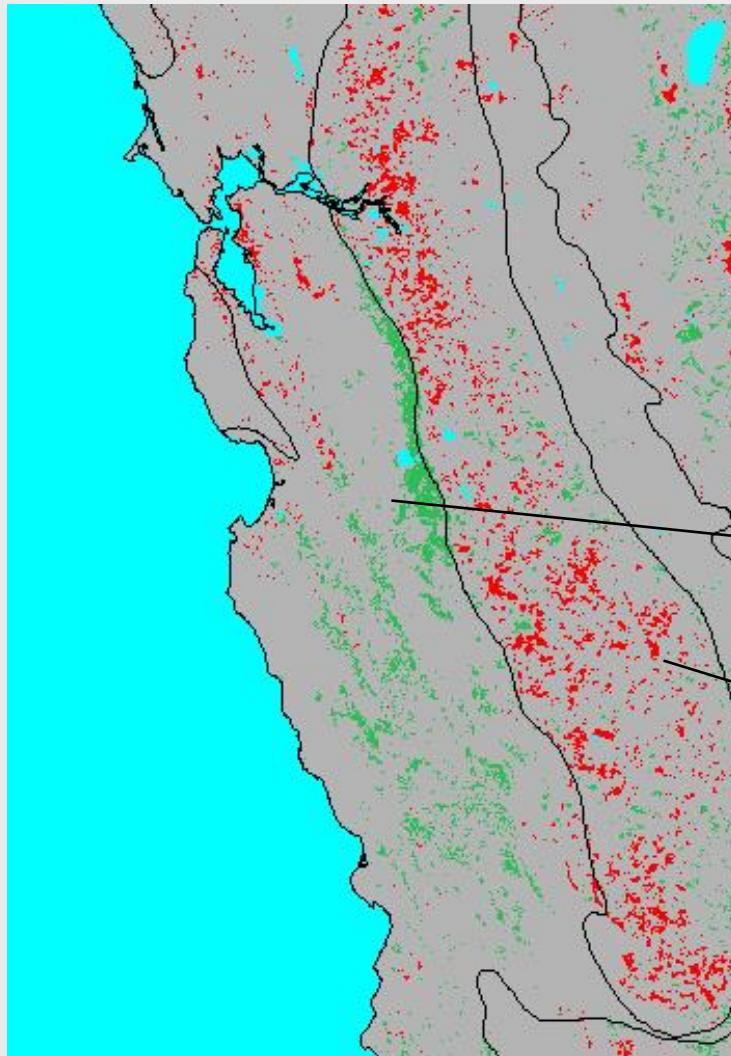
- Fire recovery**
- Land use change
- Land use practice
- Biological succession**
- Short and long-term climate change

# Analysis by Ecoregion

Level III Ecoregions of the Conterminous United States



Map Source: USEPA, 2003



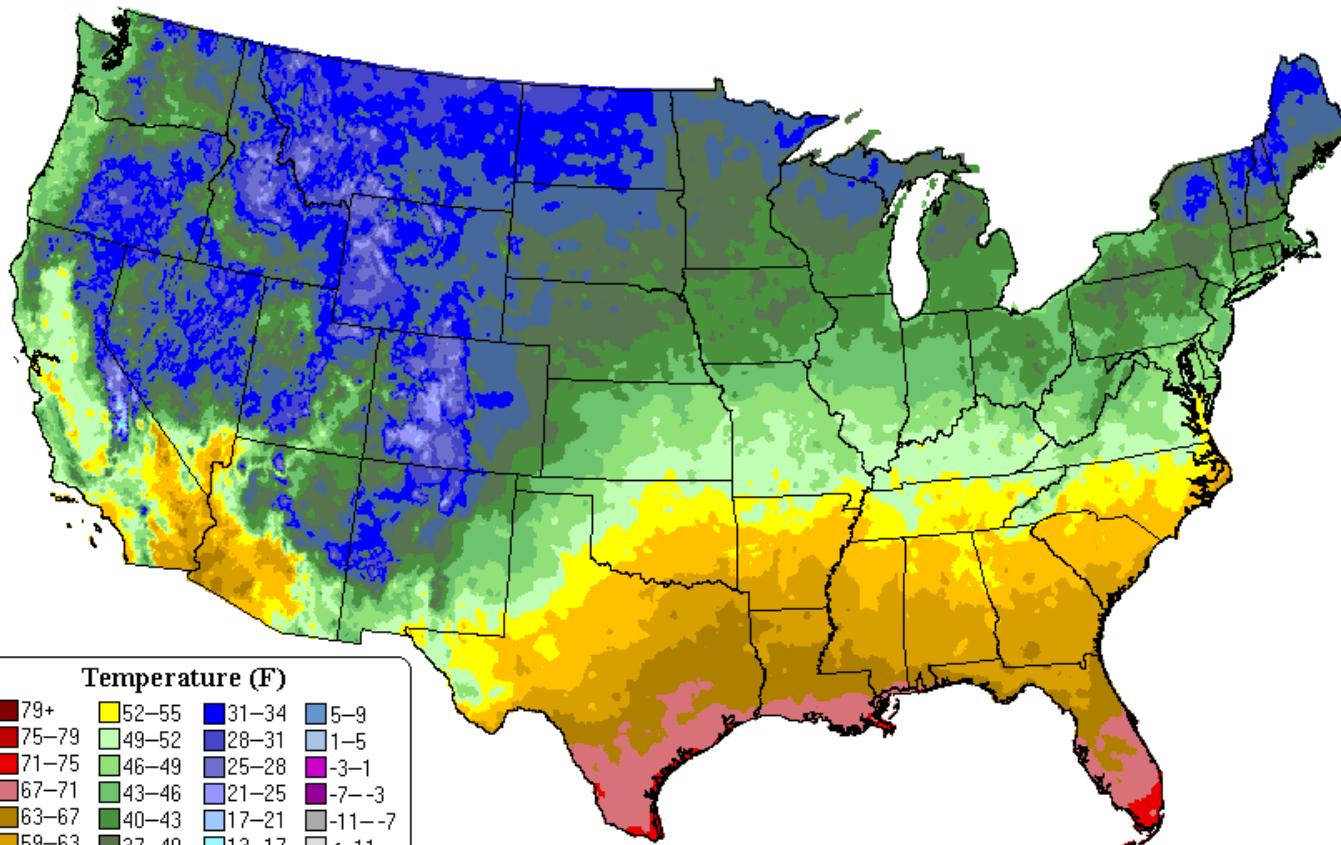
In many, but not all, instances trends follow ecoregion boundaries.

Southern and Central California Chaparral and Oak Woodlands

Central California Valley

# Climate Data Source: PRISM

**Minimum Temperature: Oct 2004**  
Provisional Data



5km Grid

Temperature  
x Monthly max  
x Monthly min

Precipitation  
Monthly Total

# Agricultural Data

**Source: USDA National Agricultural Statistical Service**

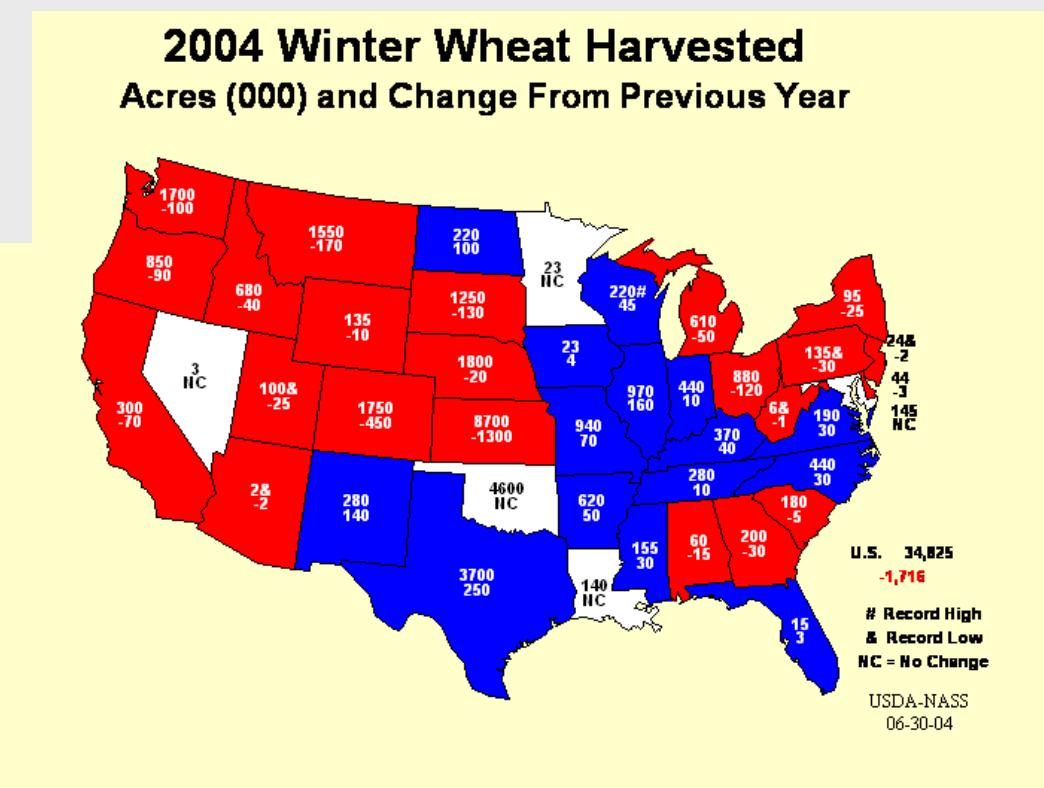
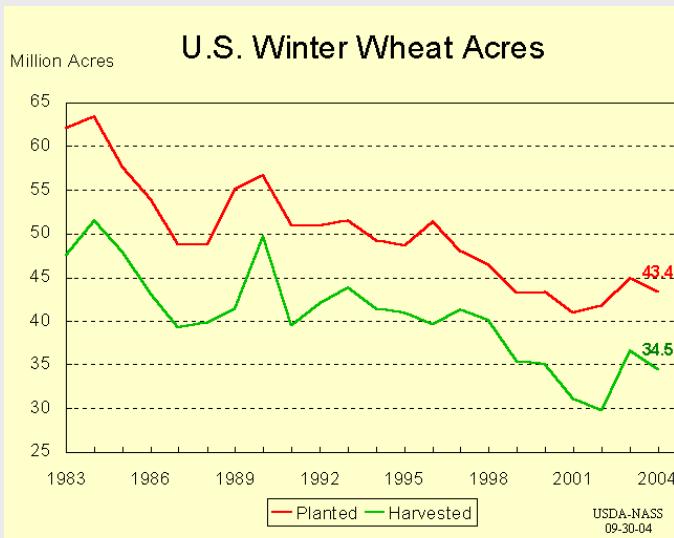
County-level data for all crops

Acres planted

Acres harvested

Yield

Production

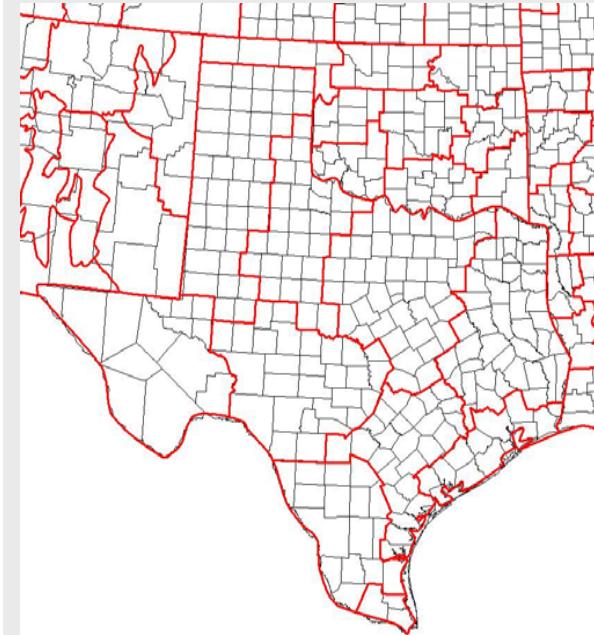
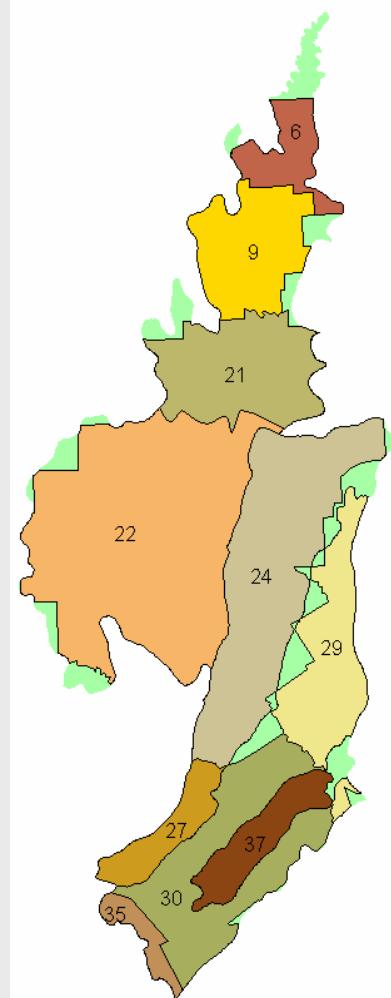


# Evaluation of Trends

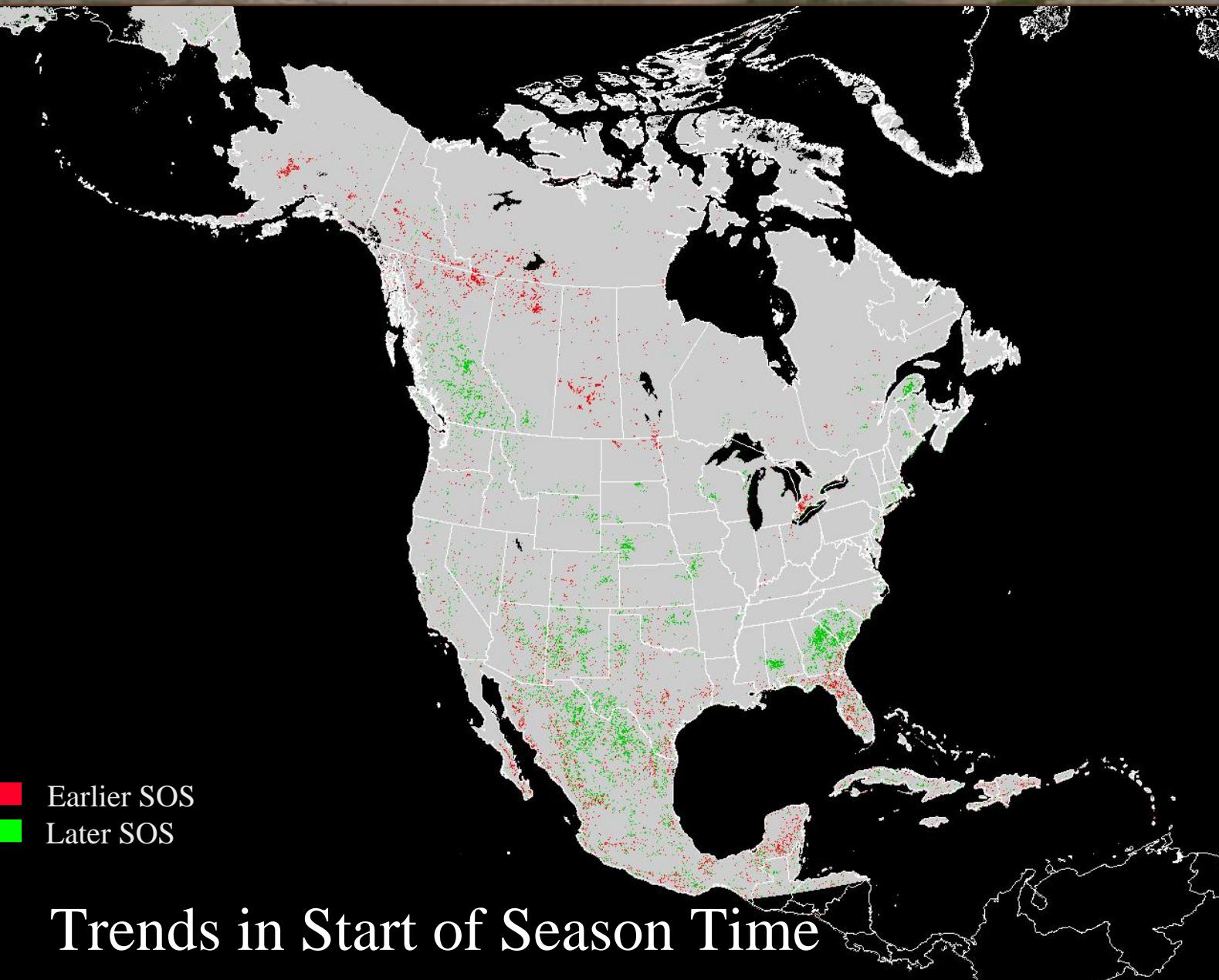


Sub-ecoregion-level analysis

Climate division summaries  
of temp/precip from PRISM

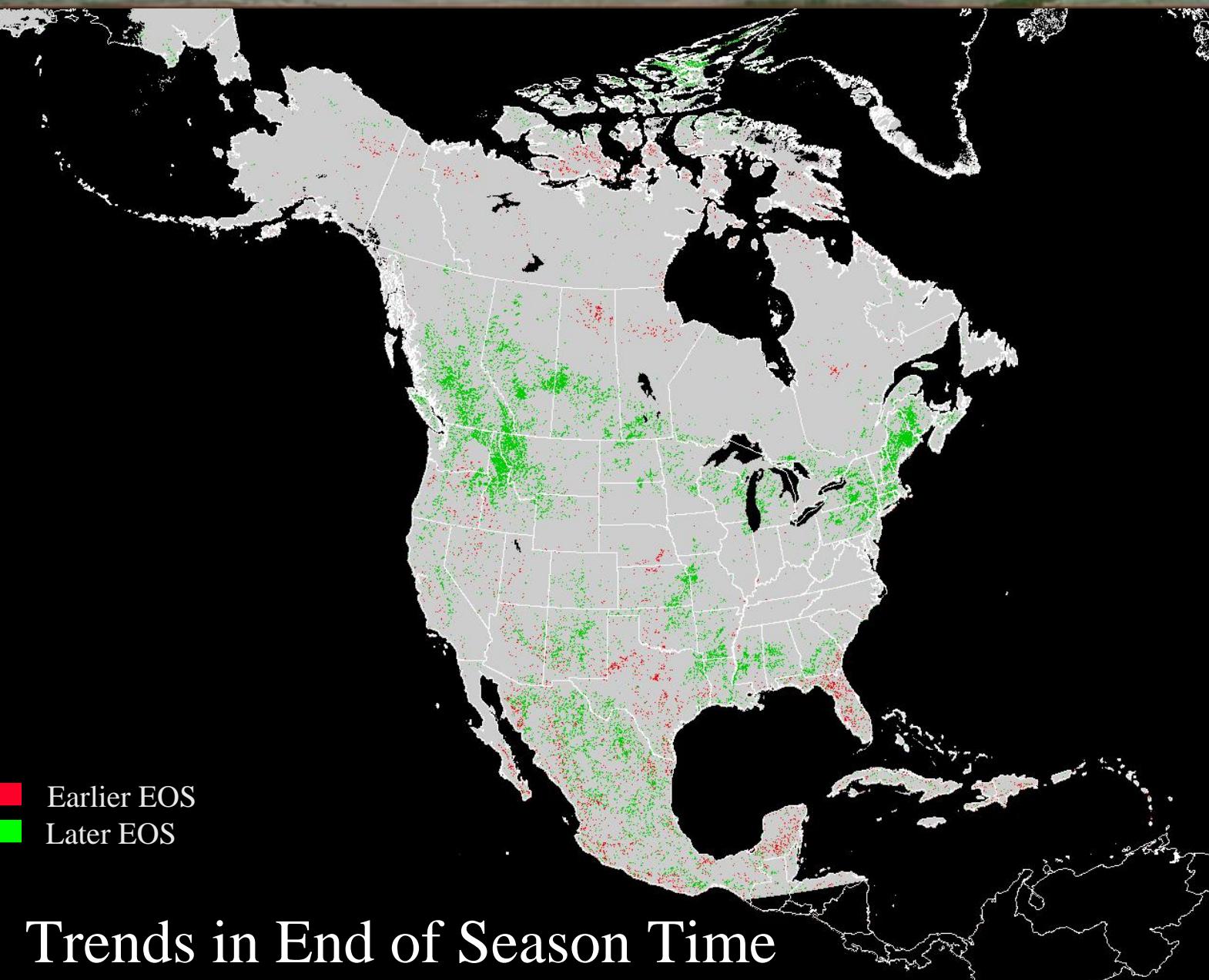


County-level  
agriculture statistics

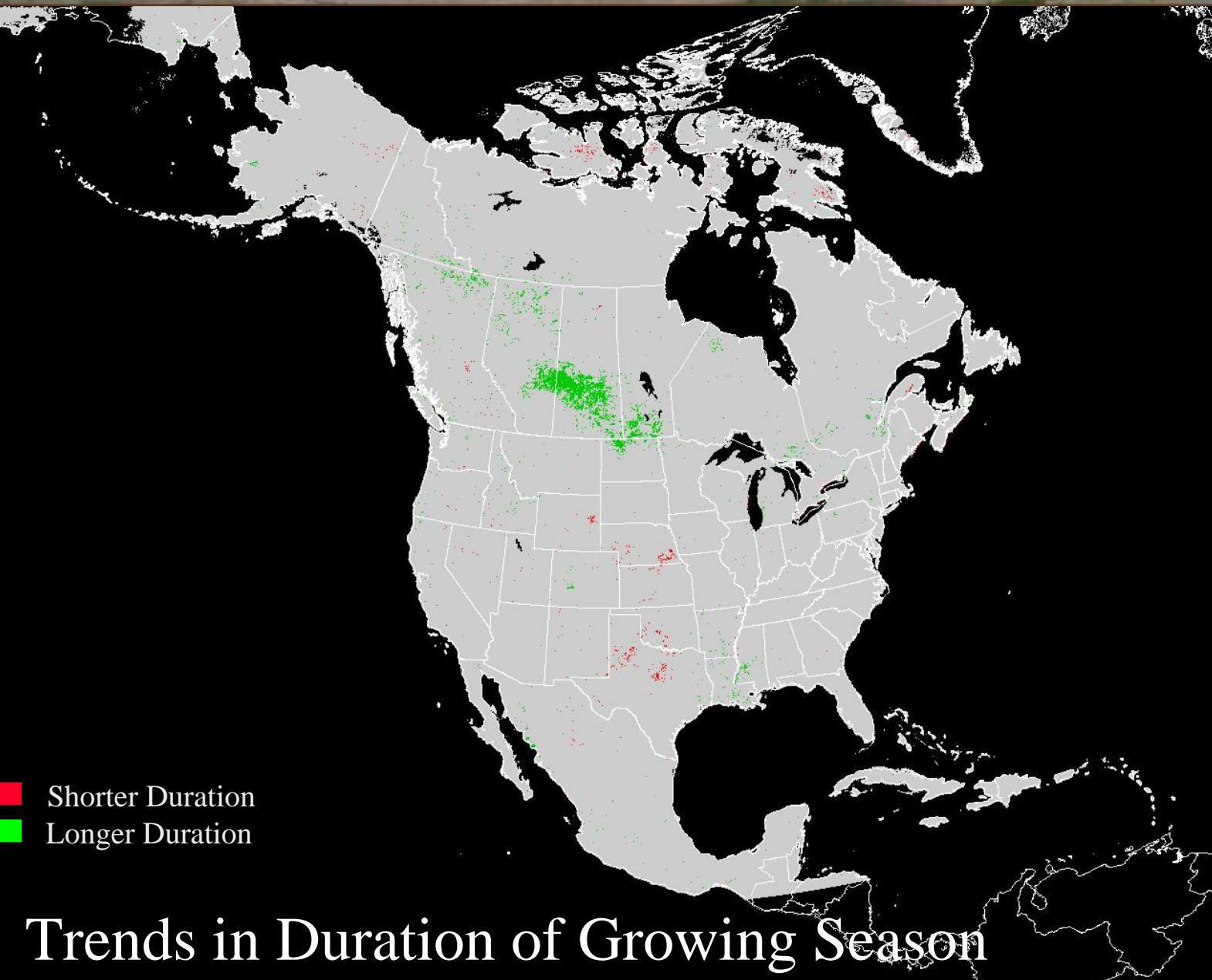


**Analysis  
based on  
GIMMS  
(aka  
Jim's) 8-  
km  
AVHRR  
data from  
1982-2003**

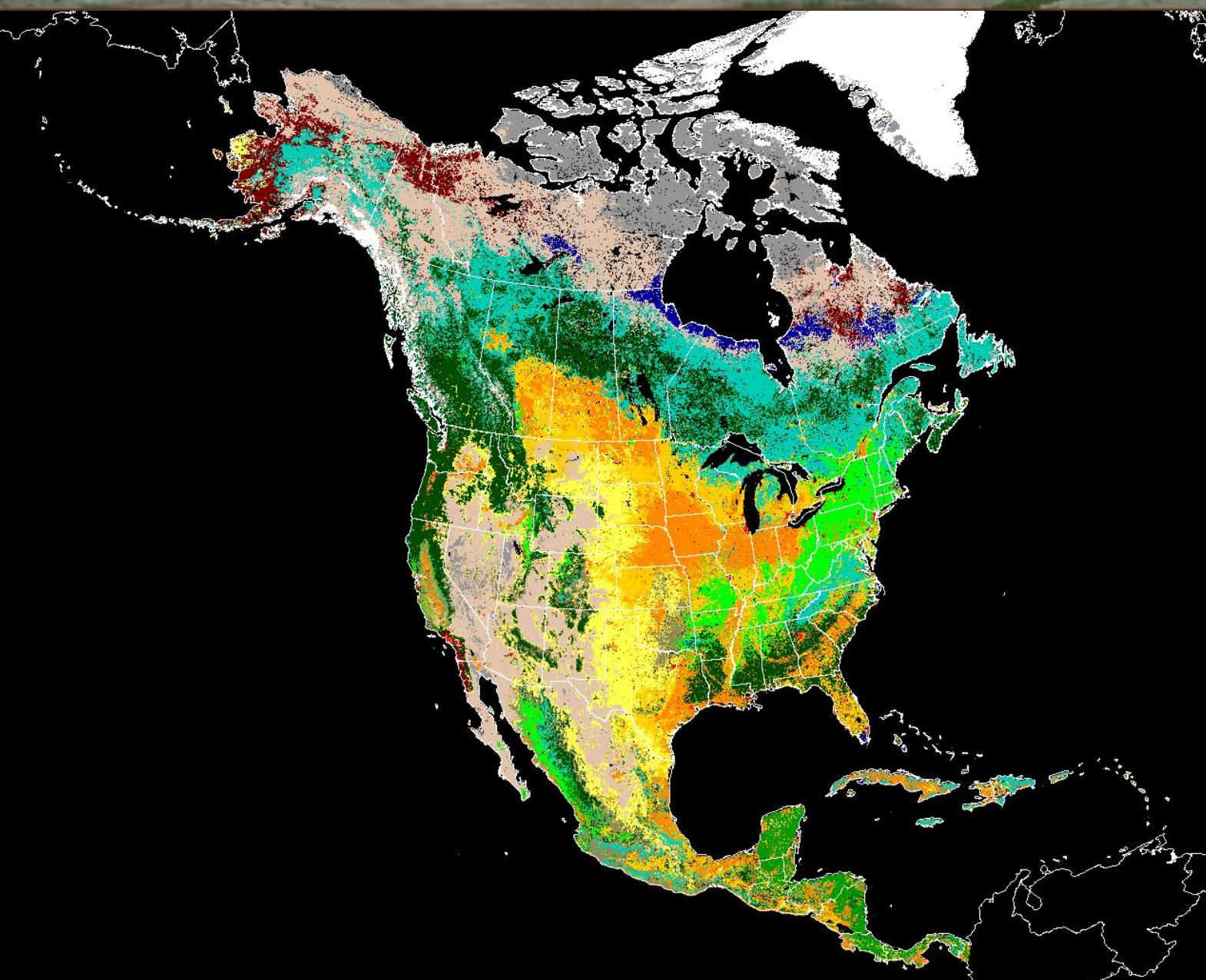
Trends in Start of Season Time

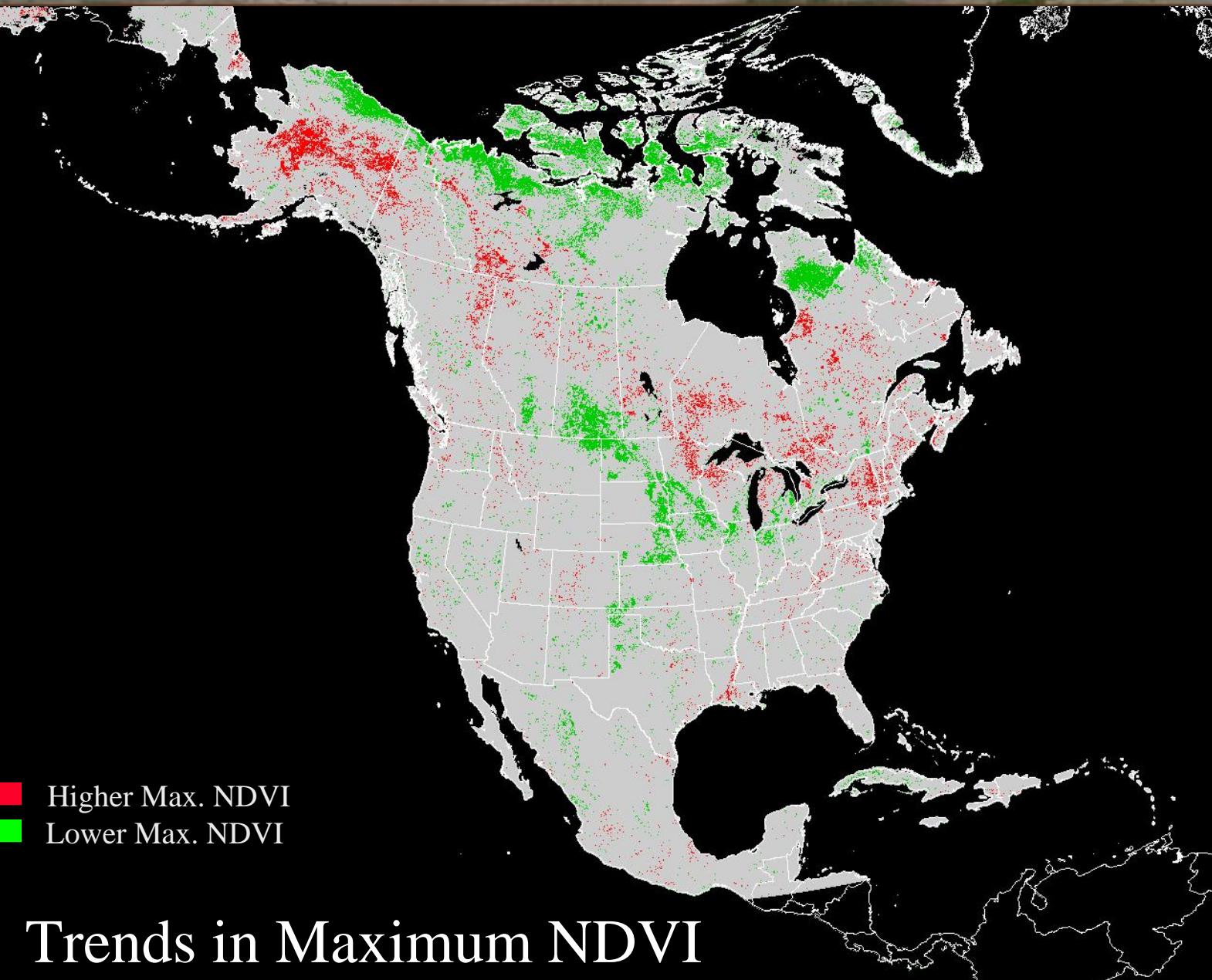


Trends in End of Season Time

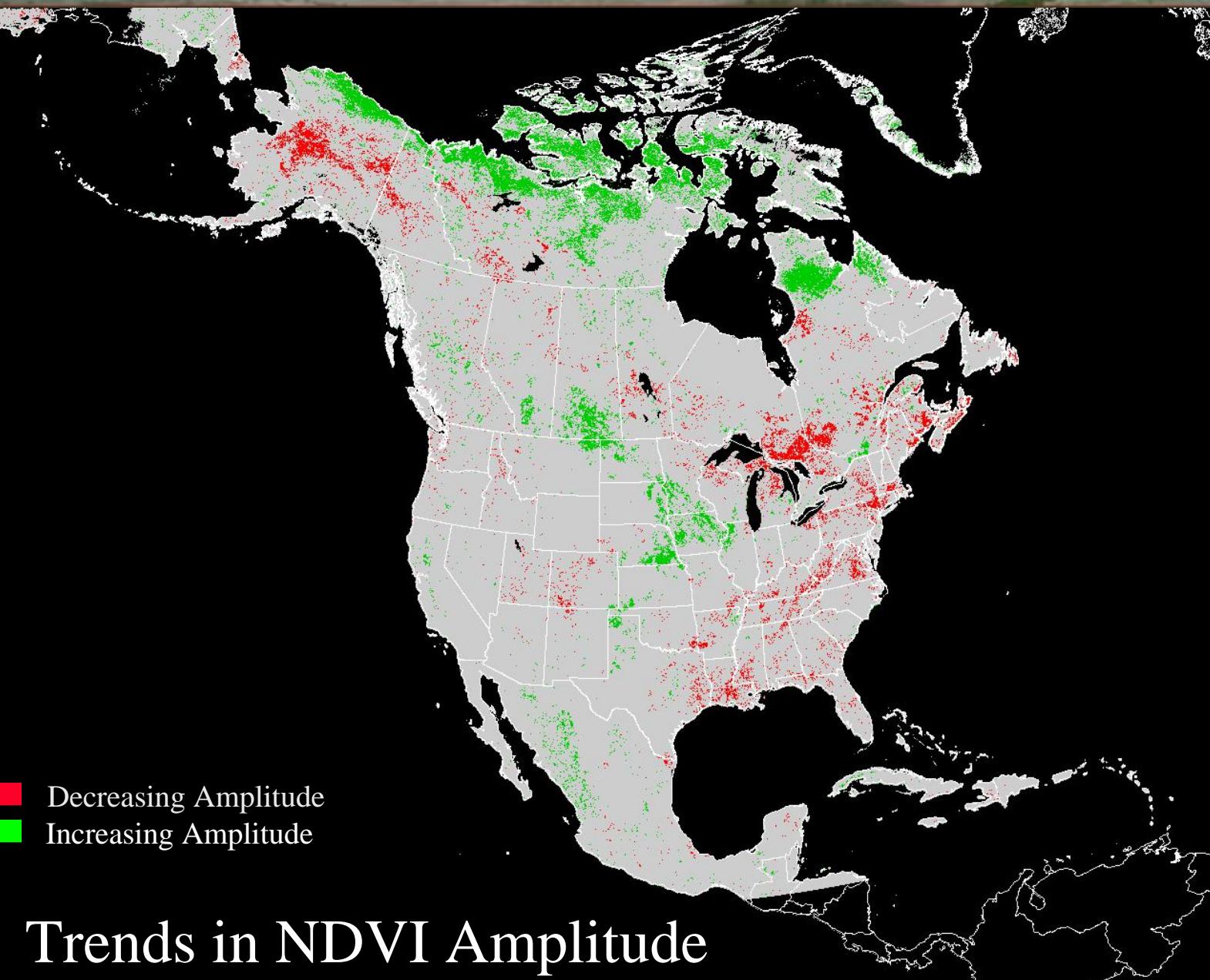


Trends in Duration of Growing Season

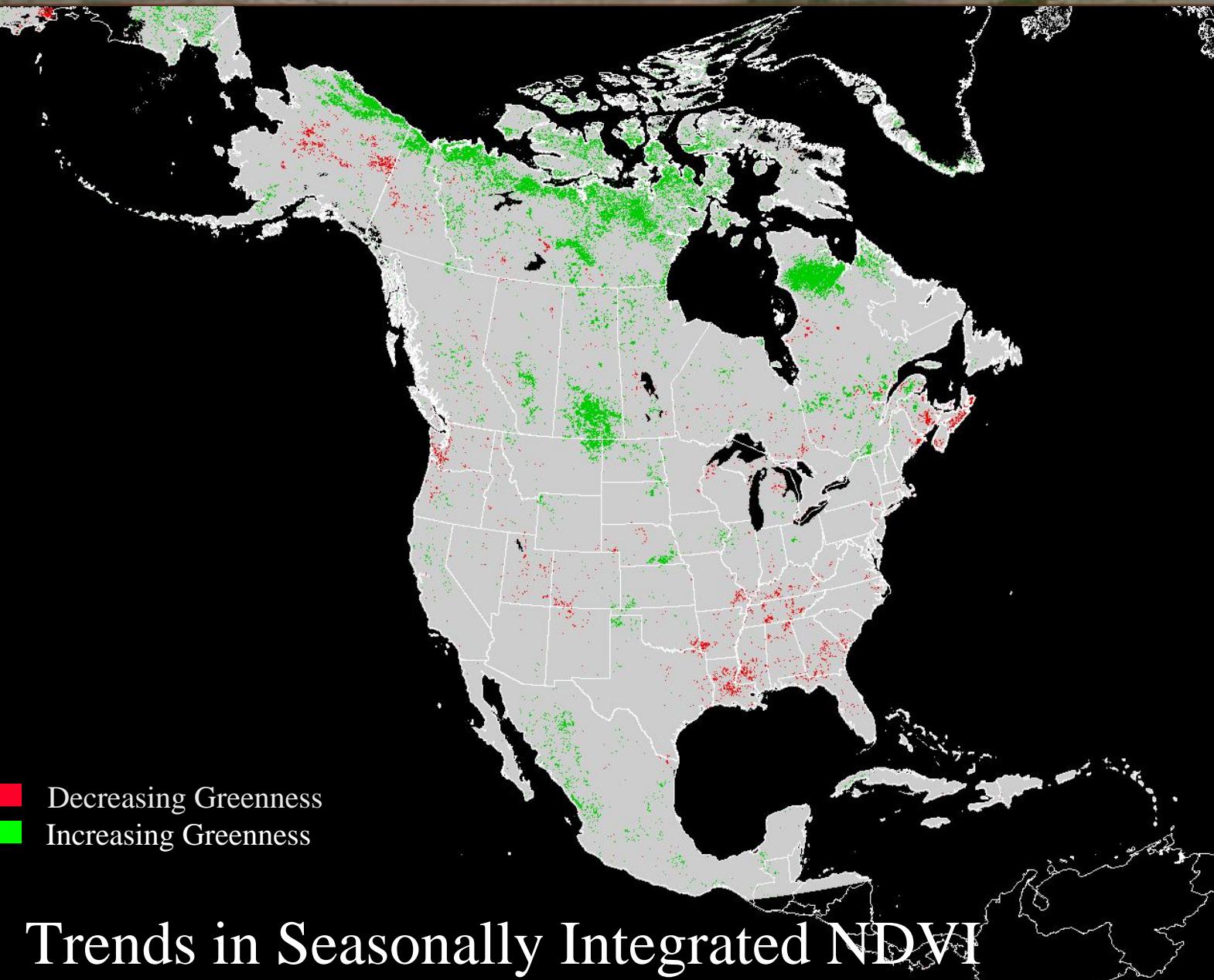


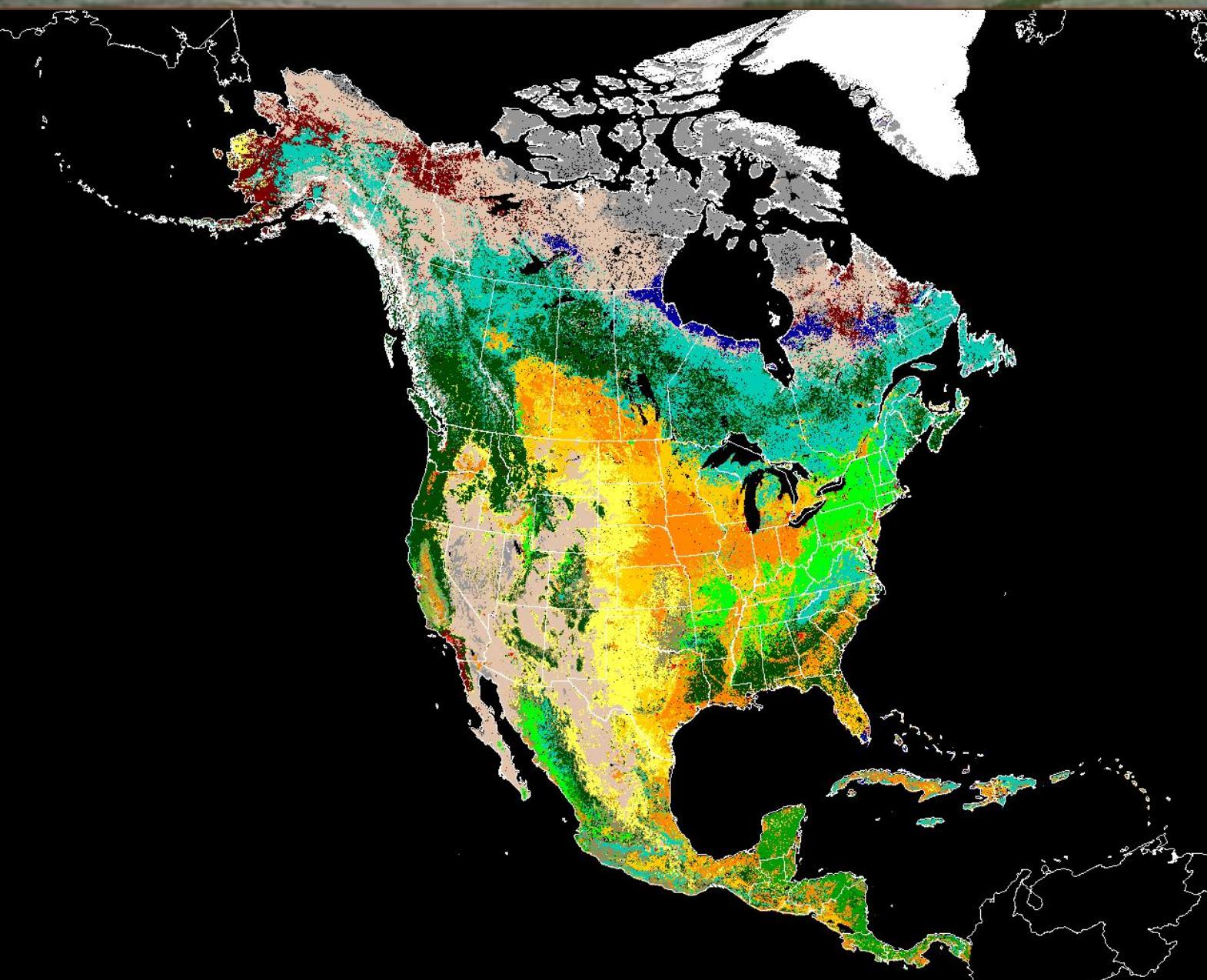


Trends in Maximum NDVI



Trends in NDVI Amplitude







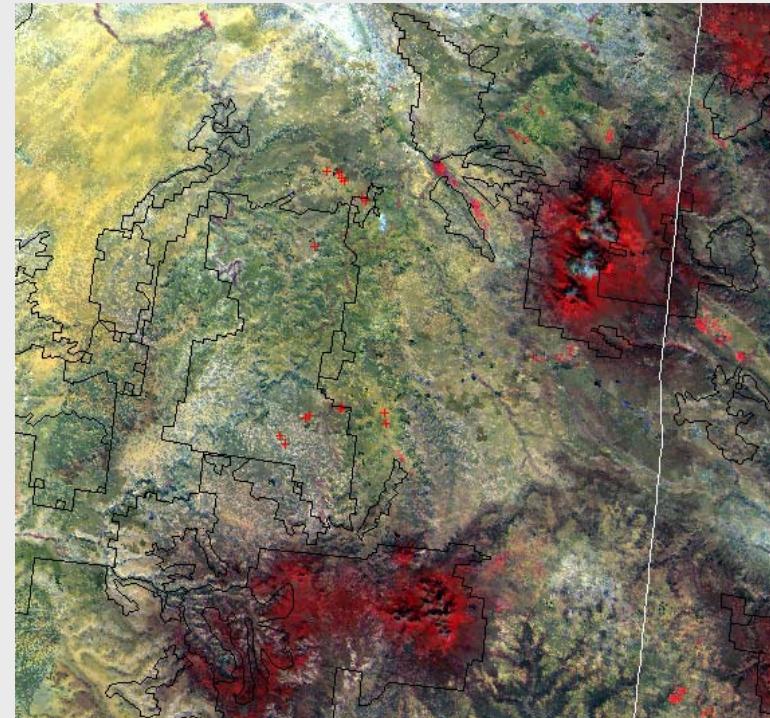
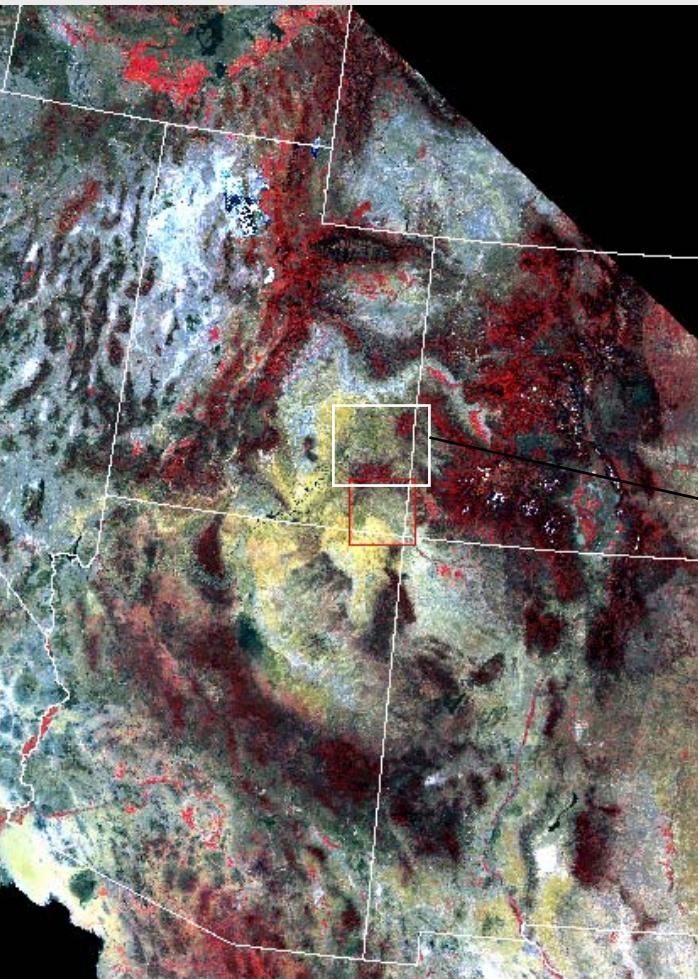
# Future of Trends in Phenology Research

Input into USGS “Geographic State of the Nation”  
(Status and Trends Report)

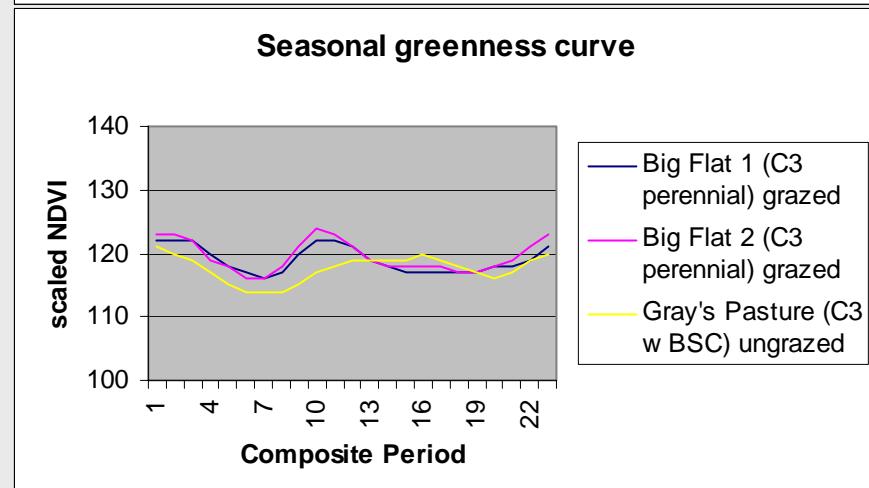
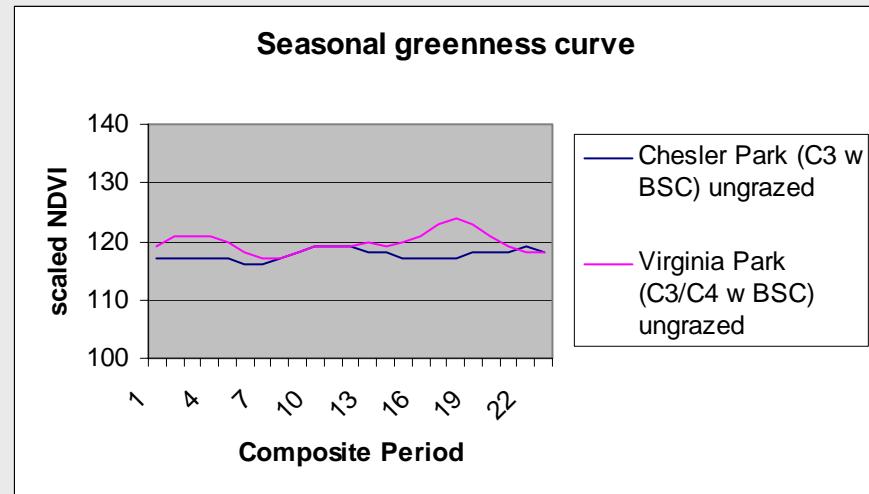
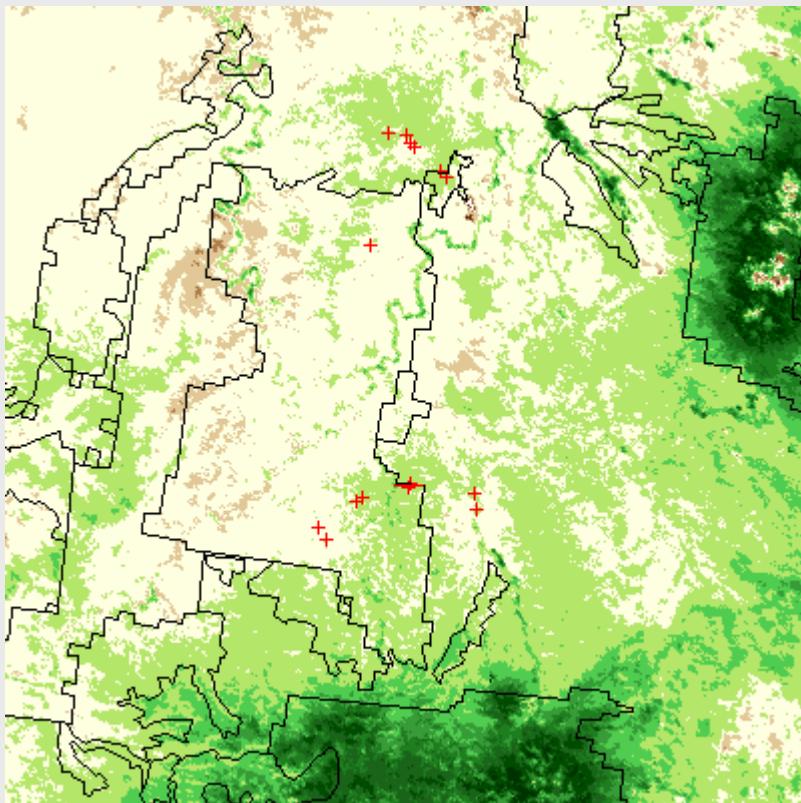
Expanding to North America, then to N.  
Hemisphere,  
finally to globe

Real-time monitoring from MODIS Direct  
Broadcast system(s)  
- will require DBS cooperative network

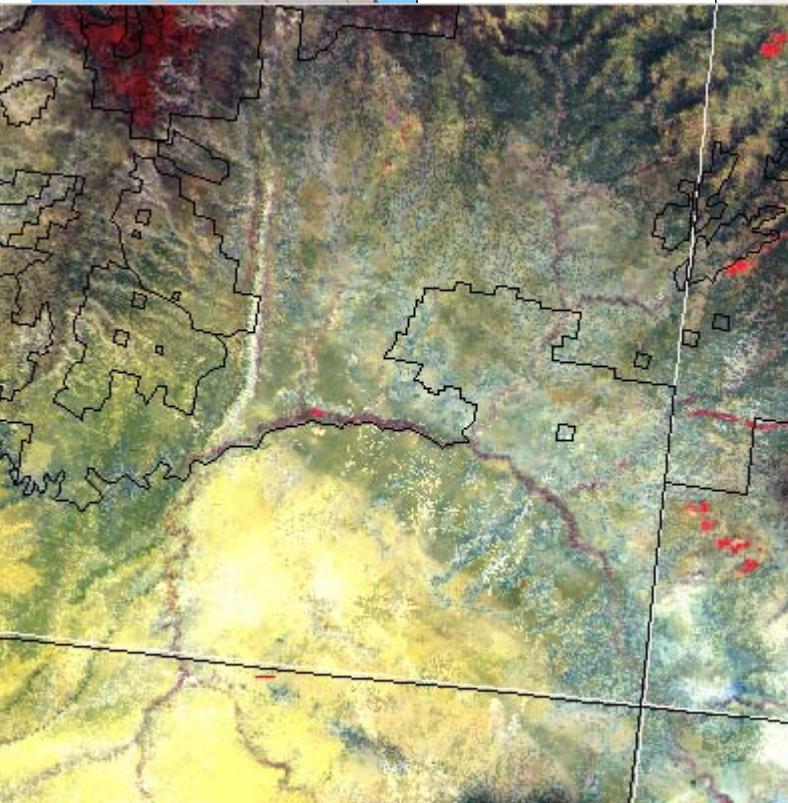
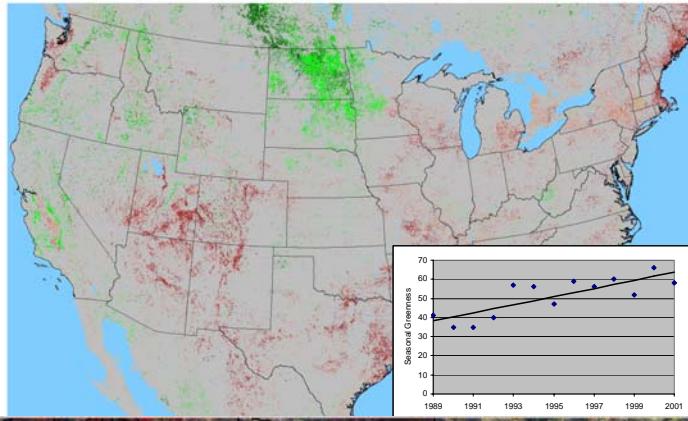
# Colorado Plateau Pilot Study



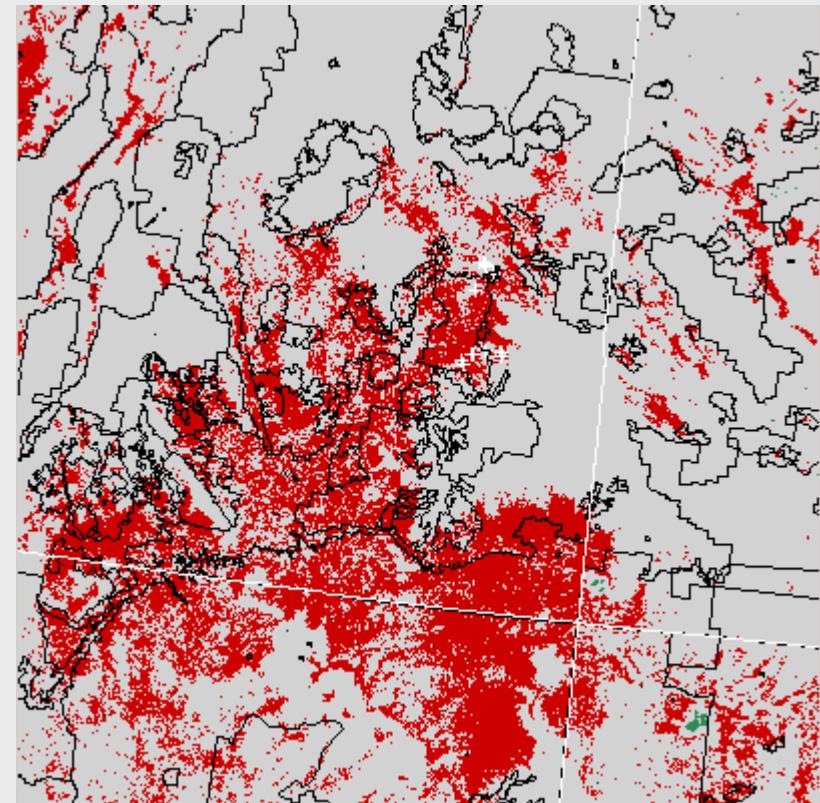
# MODIS 250m temporal curves (2002)



Seasonally-Integrated NDVI Trends 1989 - 2000



# Trends in Seasonally integrated NDVI (1989-2002)

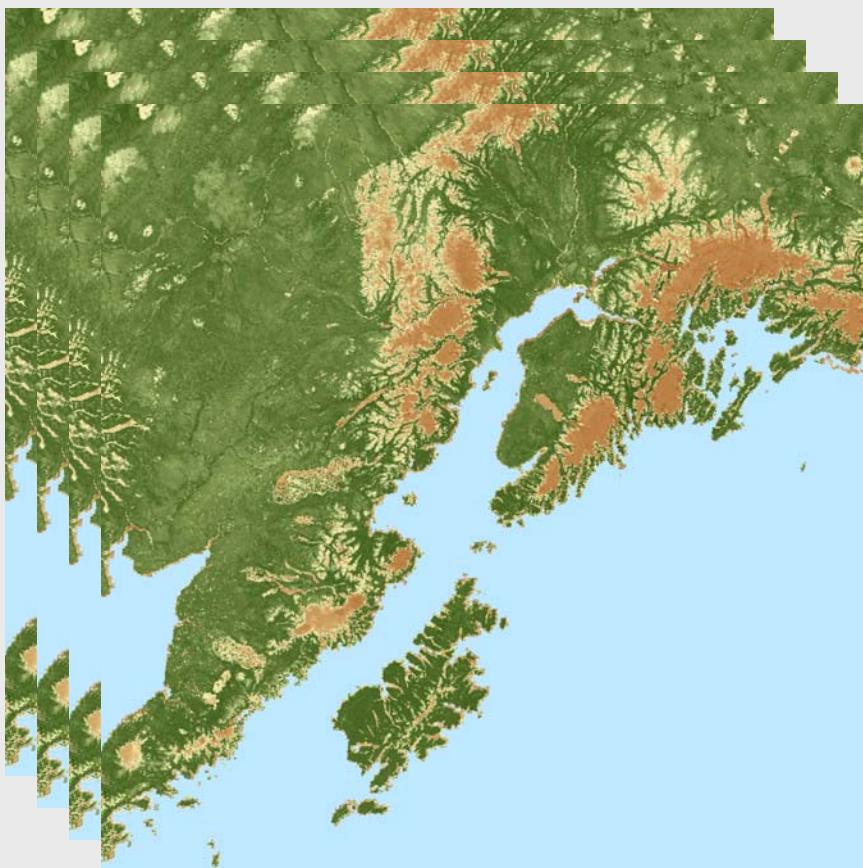


# Objectives for NPS/SWAN Collaboration

- 1) Create a database of pertinent MODIS and ASTER data
- 2) Develop automated methods to collect, mosaic, reproject, and reformat MODIS data covering the network area on an ongoing, operational basis
- 3) Produce phenological metrics over the SWAN for each year beginning in 2000 from time-series VI data
- 4) Investigate methods for estimating the presence of suspended sediments and their spatial extent using MODIS surface reflectance
- 5) Examine methods for estimating snow and ice cover using the MODIS snow cover extent product (separation of snow from cloud)
- 6) Develop monitoring protocols including standard operating procedures (SOPs)

# Primary Tasks

- 1) Create a database of pertinent MODIS and ASTER data



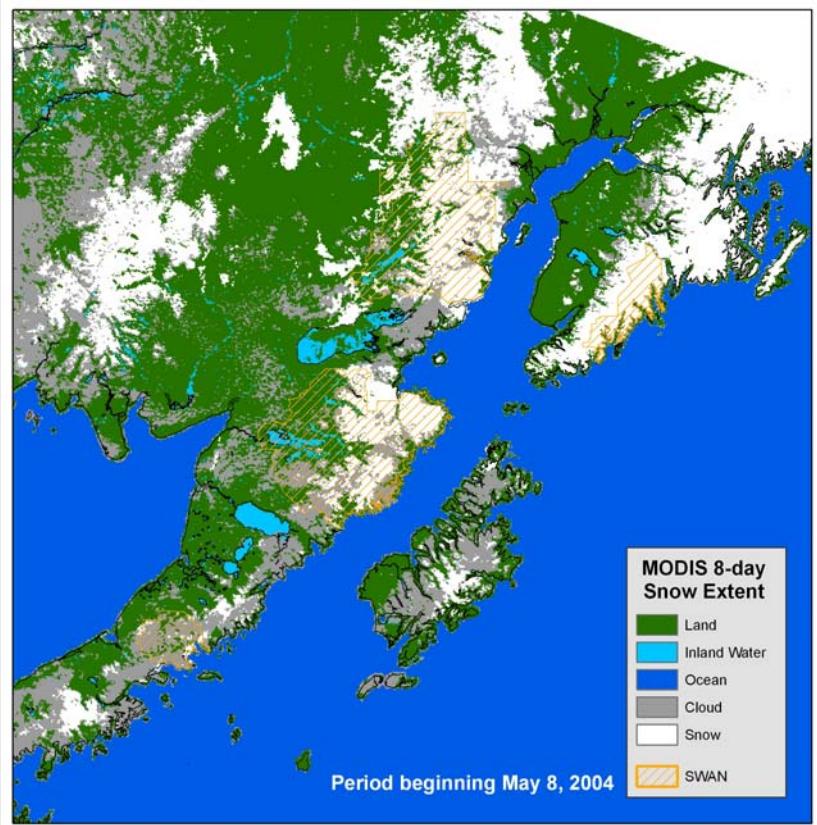
Time-series VI data



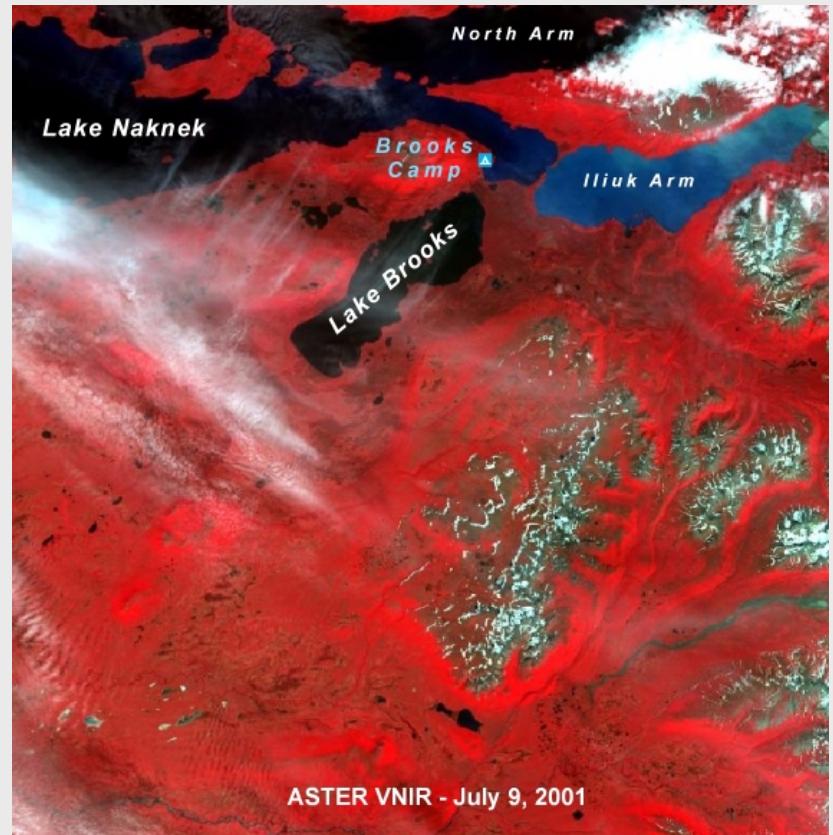
Surface Reflectance

# Primary Tasks

- 1) Create a database of pertinent MODIS and ASTER data



Snow cover extent



ASTER